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PRINCIPAL INVESTIGATOR: Garry P. Nolan, Ph.D.

CONTRACTING ORGANIZATION: The Leland Stanford Junior University

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#### 14. ABSTRACT

Primary ovarian cancer (OC) represents a complex set of stem cell and cancer cell phenotypes embedded in a mixture of stromal and infiltrating immune cells. This grant develops techniques and approaches using mass cytometry that organize the heterogeneity within and between patient tumors to enlighten mechanisms and clinical opportunities in the apparent chaotic structure of the cancer. (1) A preliminary mass cytometry OC dataset by a "social clustering" strategy finds cell neighborhoods in high dimensional space reveals that 18 out of 20 samples had clusters of apparent stem-cell expressing deterministic combinations of stem cell markers. (2) Two high dimensional antibody panels were optimized and assembled to interrogate the tumor and immune cell compartments. (3) Indivumed (Hamburg Germany) is established as source for acquiring high quality HG-SOC primary specimens from single-cell dissociated tumors obtained within 3 hours of resection. (4) A QC procedure was established that surveys tumor samples (including epithelial, mesenchymal and immune cells) prior to their resection (using Abs against cleaved cCaspase 3, cleaved cPARP, vimentin, E-cadherin and CD45) to focus resection procedures on viable non necrotic tissue. (5) Eight key cell lines which bear remarkable genetic similarity to primary HG-SOC tumors have been obtained [1] as standards for primary tumors.

#### 15. SUBJECT TERMS

Tumor initiating cells, <u>Modularity Optimization</u> in <u>Networks of Cellular Phenotypes</u> (MONOCLE), primary diagnostic samples, Indivumed, dissociation conditions, evaluation of viability and apoptosis, immunohistochemistry, validation of tumor antibodies, validation of immune cell antibodies, ovarian cancer cell lines, future plans.

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#### **INTRODUCTION**

High-grade serous ovarian cancer (HG-SOC) is the most common form of ovarian cancer and the majority of patients presenting with the disease respond well to initial treatment. However 70-90% of patients subsequently relapse and die of their disease [2, 3].

At present there is no consensus regarding the cell type that gives rise to HG-SOC. Several hypotheses have been proposed including ovarian surface epithelia and the fimbriae epithelia of the fallopian tube [4-6]. What is apparent is the diverse pathophysiology of the disease-- with ovarian cancer demonstrating a multitude of molecular and cellular alterations. This so-called heterogeneity has confounded attempts to establish the cellular origin of HG-OC and the differentiation stages at which "stemness" arises has hampered the search for successful treatment regimens, and begs the question of how we will bring order to this heterogeneity.

Therefore, with a need to organize the diverse nature of OC as the driving force for our research strategy, our approach has been to dismantle the tumor into its constituent single cells, to undertake deep phenotyping of each based on as many as 40 features per cell in a high throughput format, and then compare cell types both within as well as across tumors. *To ultimately tackle both these issues my lab is using a transformative proteomics technology termed mass cytometry, (aka Cytometry by Time of Flight (CyTOF)) which permits simultaneous measurements of up to 40 parameters per single-cell (expected to increase to ~70 primary channels and 200 or more pseudo channels), to provide a systemwide view of HG-SOC. Constituent single cells from disaggregated ovarian tumors are analyzed to enable the delineation of the molecular and cellular basis of tumor heterogeneity in HG-SOC. This information is essential for permitting early diagnosis, chemoprevention, risk assessment, development of new therapies and personalized treatment regimens for this deadly disease.* 

#### **BODY**

#### D.1 Background

Single mass cytometry facilitates high-dimensional, quantitative analysis of the effects of bioactive molecules on cell populations at single-cell resolution. Datasets are generated with antibody panels (upwards of 40) in which each antibody is conjugated to a polymer chelated with a stable metal isotope, usually in the Lanthanide series of the Periodic Table [7-10] and **Appendix A** for copy of reference 8. The antibodies recognize surface markers to delineate cell types, such as immune, epithelial, mesenchymal, and intracellular signaling molecules demarcating multiple cell functions such as survival, DNA damage, cell cycle and apoptosis. By measuring all these parameters simultaneously, the signaling network state of an individual cell can be measured. A proof-of-principle for this technology described the immune continuum within a healthy bone marrow sample [11].

The body of the text will discuss progress over the last year (and current ongoing efforts) which pertains largely to **Task 1.** Specifically:

- Subtask 1a: Establish conditions for dissociation of solid tumors into single cells.
- **Subtask 1b:** Select a panel of extracellular modulators with which to measure signaling responses (done in the context of titrating the antibodies).
- Subtask 1c: Select two panels of ~60 antibodies each (this should have been 40 in the original SOW).
- Subtask 1d: We have submitted and gained approval for the necessary HRPO (IRB) and the ACURO.
- Subtask 1e: Acquire 10 primary diagnostic (no treatment) ovarian tumor or ascites samples with matched blood samples (Neel lab at UHN Toronto, and Berek at Stanford). In a new development we are now acquiring samples from Indivumed in Hamburg Germany.
- Subtask 1f: Develop and apply new informatics tools and algorithms.
- Subtask 2b: Cell line validation of monitoring reagents for extracellular modulators of signaling pathways.

#### D.2 Foundational Experiments

In earlier studies that were foundational for this award the *Neel lab* performed high throughput screening of surface marker expression in primary HG-SOC samples by fluorescence-based flow cytometry. The data identified a number of markers that were either expressed consistently in low percentages of cells ("minority markers" n=65) or were variably expressed in different cells ("variable markers" n=35) across different samples. Such markers would either represent spurious expression of proteins with little to no relevance to OC, or potentially represented markers associated with rare subpopulations of some benefit to the continuance of the tumor. A CyTOF panel was assembled, comprised of thirty-one metal-conjugated antibodies, against a set of these markers (from the high throughput screen) in combination with Pax-8, (a transcription factor representing cells of Mullerian origin), potential stem cell markers (e.g., Sox2, Nanog, Bmi-1, unphospho  $\beta$ –Catenin) and DNA damage (pATM, pH2AX) and cell cycle proteins (cyclin B1, pRb and pHH3) for experimentation and analysis of 21 primary HG-SOC tumors and 30 ovarian cancer cell lines carried out in the *Nolan Lab* at Stanford.

In order to capture the depth of information that a CyTOF dataset provides there are informatics challenges at several levels. These include the multi-dimensional nature of the data, which results in the need to analyze millions of single-cell measurements, the distorted space of the data distribution, owing to the differential dynamic range of each antibody, differences in cell size, etc.), and the possibility that sub-populations assume different shapes in multi-dimensional space and include vastly different numbers of cells. It is therefore necessary to have a number of complementary, overlapping and mutually exclusive computational approaches for analyzing CyTOF data. To date there have been several approaches taken to analyze CyTOF data [12-15].

The  $Pe'er\ Lab$  developed a new algorithm Modularity Optimization in Networks of Cellular Phenotypes (MONOCLE) that adapts network theory to analyze mass cytometry data, employing a "Facebook"-like strategy. First, "k-neighborhoods" are assigned for each single-cell measurement (in 31 parameter-space). A pilot density of k = 20-50 is employed (i.e., the 20-50 nearest cells) and Mahalanobis, rather than Euclidean, distances are used to identify neighbors in the distribution. This innovation deals with the different dynamic ranges of antibody intensity/cell size defined above. A "Similarity Score," defined as the intersection of k-neighborhoods, is

then calculated for each pair of points. The Louvain method of community detection is then employed to identify clusters in the network.

Preliminary data, applying MONOCLE to the CyTOF data resulted in the identification of 34 clusters of cells. Seven of these were CD45+, representing the immune cell infiltration in the primary tumors; gratifyingly, these clusters were recognized as distinct from the cell lines and the other, non-lympho-hematopoietic cells in the primary tumor samples. Six other clusters were Vimentin+, which could indicate infiltrating stroma or epithelial-mesenchymal-like properties in the primary tumor. The remaining clusters varied in size, but four were generally small and enriched in stem cell markers. Remarkably, 18/20 primary sample had significant populations of at least one of these "stem cell-like" clusters, and in most samples, these clusters were mutually exclusive (i.e., the sample had one or at most two types of clusters, but not all four).

These findings are intriguing for several reasons. First, they are consistent with previous work from the *Neel lab* indicating that the surface phenotype of tumor initiating cells (TIC) from HG-SOC is heterogeneous [16]. Second, they emphasize the potential benefit of coupling analysis of putative functional stem cell markers (e.g., SOX2, etc.) to surface antibody assessment. Third, and most interestingly, they suggest clear sorting strategies for enriching such clusters from primary HG-SOC samples, experiments of which are in progress in the *Neel lab*.

Given the above results, and the potential advantage of using functional markers to identify/enrich for TIC, the *Neel lab*, is taking several additional approaches in parallel. Studies in hematopoietic stem cells, T cell-ALL and other malignancies suggest that low ROS (reactive oxygen species) might be associated with the stem cell state. Indeed, in initial experiments, the *Neel lab* has found that sorting for cells with low ROS using the fluorescence marker H(2)DCF-DA (dihydrodichlorofluorescein diacetate (DCF) enriches for cells with Sox2 and ASCL1 transcripts. We are currently examining testing whether low ROS levels can be used to enrich for TIC (using our xenograft assay[16]), as well as searching directly for additional surface markers that correlate with SOX2 expression and/or ROS levels. Such markers will be iteratively incorporated into CyTOF experiments in collaboration with the *Nolan lab* to optimize our ability to identify, quantify, and study the properties of HG-SOC TIC.

#### D.3 Parallel Studies in the Nolan Lab Landscaping HG-SOC primary samples

Using an alternative and complementary strategy, the Nolan Lab is analyzing primary diagnostic ovarian tumor samples using an antibody panel designed to interrogate the biology based on prior knowledge in the literature. In this first year we have taken considerable measures to ensure data collected is of high value. This means strict control over the sample acquisition process, stage-specific tests during the protocol to ensure we are working with live cells, and testing of every single reagent for its validity to bind the epitope against which it was originally raised. We believe these initial steps—though tedious—are critical to "trusting" the data from such precious samples as those obtained from patients with fatal diseases.

#### D.3.1 Acquisition of primary diagnostic HG-SOC samples from Indivumed, Hamburg Germany

Indivumed (Indivumed.com), based in Hamburg, Germany has developed a biobank in which stringent processing protocols are applied to fresh primary human samples (mostly tumors) such that they retain comparable patterns of biomolecules (DNA, RNA and protein) as they were in the human body. Importantly, sample collec-

tion is based on the following criteria:

- Team of on-call nurses
- Tight communication and timing with surgery team
- Present during entire surgery
- Record data such as blood supply clamping, etc.
- First to handle tissue samples after surgery
- All processing done on-site, in room adjacent to OR – tight timing
- Record observations, location of sample collection, timing, etc.
- Full clinical annotation

|            |        | Fixed Samples |             |       | ozen Samples |
|------------|--------|---------------|-------------|-------|--------------|
| Sample ID  | TB Neg | Agua-         | Aqua-/PARP- | Aqua- | Aqua-/PARP-  |
| 4079       | 37%    | 58%           | 15%         | 11%   | 4%           |
| 4080       | 90%    | -             | -           | 42%   | 11%          |
| 4081       | 86%    | 87%           | 13%         | 33%   | 12%          |
| B1930 lib  | 79%    | 78%           | 26%         | _     | -            |
| B1930 milt | 77%    | 84%           | 27%         | -     | -            |
| R847 lib   | 77%    | 76%           | 21%         | 30%   | 11%          |
| R847 milt  | 80%    | _             | _           | 14%   | 4%           |

**Table 1**: Viability of CRC samples fixed and frozen post-dissociation (Aqua) match viability post-dissociation (TB: trypan blue), although PARP cleavage is high. Viable freezing results in large decrease in viability. See text.

In her prior employment in the Biotech arena, Dr Fantl worked with Indivumed and therefore capitalized on a former very productive relationship to establish a new collaboration to procure high quality HG-SOC samples for this award. One hurdle to overcome was the preparation of viable single cells from solid tumors. Preparatory experiments were performed in the Nolan lab testing a matrix of conditions, based on enzymatic and mechanical dissociation protocols using human ovarian tumor samples from mouse xenografts. A graduate student from the *Nolan Lab* spent one week at Indivumed to optimize and transfer the procedure "on-site". In summary, given the prevalence of colorectal cancer (CRC) cases over ovarian, the dissociation conditions were established at Indivumed using CRC samples. Importantly, CRC and HG-SOC are considered "soft tumors". No ovarian cases presented during our post-doc's visit to Indivumed. Based on a comparison of conditions, in our current protocol samples are dissociated mechanically in a Milteny "gentleMACS" dissociator in the presence of a Milteny proprietary protease mix and then incubated with rotation for 30 minutes all according to the manufacturer's instructions. *Importantly single cell suspensions of HG-SOC were generated within 3 hours post resection. This will be standard operating procedure for acquisition of all our primary tumor samples.* 

#### D.3.2. Testing samples for viability post-dissociation

By way of introduction, we are using trypan blue, Aqua (for fluorescence-based flow cytometry) and cisplatin (for CyTOF) to measure the viability status of the samples. These reagents operate on the principle that a compromised cell with a damaged plasma membrane permits reagent entry into the cytoplasm, whereas a healthy cell with an intact plasma membrane does not. Good viability therefore correlates with lack of staining. At Indivumed, immediately after dissociation, the viability of the cells was determined by trypan-blue counting of a small aliquot. Samples were then exposed briefly to aqua or cisplatin, reagents that allow viability to be determined by fluorescence or mass cytometry respectively at Stanford [17]. At Indivumed, samples were either fixed in paraformaldehyde (PFA) and frozen or viably frozen in DMSO/fetal bovine serum as per Nolan lab established protocols [18]. Several important observations were made, primarily with the colon samples (Table 1), but relevant to the HG-SOC samples of which six are now at Stanford. 1) Trypan Blue staining demonstrates that cells are viable post-dissociation. 2) Fixation and freezing immediately post-dissociation results in "capturing" cells in a viable form suitable for cytometry (Aqua- column, red outline) 3) Significant cell death (apoptosis and necrosis) occurs after a "viable" freezing procedure (blue outline around last two columns). We also have this information for 4 ovarian samples in which the Aqua- cells were ~ 10% for 2 samples and ~60% for another 2. 4) In spite of good viability of fixed samples post thaw, a percentage of cells have undergone apoptosis (aqua-/PARP-column within red outline). Note: number of initial samples represents initial studies that set the groundwork for later experimental design.

#### D.3.3. Cells undergoing apoptosis preexist in primary tumors *in situ*

That levels of cleaved PARP were increased in Aqua negative cells led to the question of whether this "apoptotic state" pre-exists within the tumor or is introduced during the single-cell dissociation procedure. To evaluate this possibility, immunohistochemistry was performed with an antibody against cCaspase 3 on formalin fixed paraffin embedded sections (FFPE) at Indivumed. Apoptotic cells were detected in 7 ovarian cancer cases, whereas one case was completely negative for cleaved Caspase-3. Two cases (R873 and R892) exhibited maximal 5% of apoptotic cells. In further two cases (X2617 and x2619) 10% of apoptotic cells

| Sample no.  |                | sity               | %                  | С     | ompartme | nt                    |  |
|-------------|----------------|--------------------|--------------------|-------|----------|-----------------------|--|
|             | Tissue type    | Staining Intensity | Positive cells (%) | Tumor | Stroma   | Inflammatory<br>cells | Comment  |
| R866-Tp13   | ovarian cancer | 0                  | 0                  | 0     | 0        | 0                     |  |
| R873-Tp11   | ovarian cancer | 1+                 | ≤5                 | х     | 0        | 0                     | only surface tumor epithelium weak positive  |
| R892-Tp11   | ovarian cancer | 1+                 | ≤5                 | x     | 0        | x                     | some inflammatory cells and detritus positive  |
| X2617-Tp12  | ovarian cancer | 2+                 | 10                 | 0     | x        | x                     | mainly inflammatory cells positive   |
| X2619-Tp12  | ovarian cancer | 2+                 | 10                 | 0     | x        | x                     | mainly inflammatory and stroma<br>cells positive, only single tumor cells<br>positive  |
| X2623-Tp111 | ovarian cancer | 1+                 | 30                 | x     | x        | x                     | tumor cells partly very weak<br>positive, majority only with<br>nonspecific background |
| Z289-Tp111  | ovarian cancer | 1+                 | 20                 | х     | х        | 0                     | mainly tumor cells positive (very weak)  |
| Z301-Tp111  | ovarian cancer | 2+                 | 50                 | х     | х        | х                     | mainly tumor cells positive ( weak to<br>moderate)                                     |
|             |                |                    |                    | _     | _        |                       |  |

**Table 2** Histopathological evaluation of anti-Caspase-3, cleaved immunohistochemistry. (0 = negative, 1+ = weak, 2+ = moderate, 3+ = strong, x = positively stained)

were detected. A high percentage (20%, 30% and 50%) of apoptotic cells was determined in three cases (Z289, 2623 and Z301). The results for HG-SOC samples were evaluated independently by two pathologists (**Table 2**).

These samples will be evaluated by flow in the coming weeks.

### D.3.4. Reagent validation and characterization

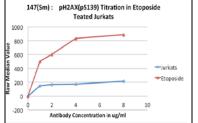
Antibodies: We have developed two antibody panels against tumor cells and one against the infiltrating immune cells. Antibodies were either, purchased metalas conjugates, or conjugated by us to metal-chelating polymers and were all titrated against positive and negative controls to optimize signal to noise (see appendix for titrations). Multiple antibody clones were tested from different vendors, the details of which are given in Table 3 (Tumor antibody panel) and Table 4 (Immune panel). Two exemplar titrations are shown for CD133, a stem cell surface marker (Figure 1a) and pH2AX, a transducer of DNA damage (Figure 1b), both critical components of ovarian cancer biology. Our complete sets of titrations are in Appen-

| Mass | Element | Antibody            | Clone         | Vendor       | Catalogue Number | Titration Cell Lines        |
|------|---------|---------------------|---------------|--------------|------------------|-----------------------------|
| 113  | In      | Not used            |               |              |                  |                             |
| 115  | In      | Vimentin            | D21H3         | CST          | 5741BF           | OVCAR3, NIH3T3              |
| 139  | La      | CD45                | H130          | Biolegend    | 304002           | OVCAR3, PBMCs               |
| 141  | Pr      | N Cadherin          | 8C11          | BD           | 561553           | HeLa, OVCAR                 |
| 142  | Nd      | c-Casp 3            | C92-605       | BD           | 624084           | Jurkat,24hr Etoposide +/-   |
| 143  | Nd      | CA125               | X75 (3C8/4)   | Gen Way      | GWD-17DD7A       | U937, OVCAR3                |
| 144  | Nd      | CD90                | 5E10          | Biolegend    | 328102           | K562, Jurkats               |
| 145  | Nd      | p-AMPK (pT172)      | 40H19         | CST          | 2535BF           | U937, 24hr AICAR+/-         |
| 146  | Nd      | p-ATM (pS1981)      | 10H11.E12     | Millipore    | 05-740           | Jurkat, 4hr Etoposide +/-   |
| 147  | Sm      | p-H2AX (pS139)      | JBW301        | Millipore    | 05-636           | Jurkat, 4hr Etoposide +/-   |
| 148  | Nd      | Total Cyclin B1     | GNS-1         | BD           | 554176           | HCT116, Nocodazole +/-      |
| 149  | Sm      | p-NFkB (pS529)      | K10-895.12.50 | BD           | 558393           | Jurkat, TNF +/-             |
| 150  | Nd      | pBCL2 (S70)         | 5H2           | CST          | 2827BF           | OVCAR3, Taxol +/-           |
| 151  | Eu      | p-ERK (pT202/pY204) | DA3.14.4E     | CST          | 4370BF           | U937, PMA +/-               |
| 152  | Sm      | Ki67 (total)        | B56           | BD           | 556003           | HCT116, Nocodazole +/-      |
| 153  | Eu      | p-CHK2 (pT68)       | C13C1         | CST          | 2661BF           | HCT116, Nocodazole +/-      |
| 154  | Sm      | pSTAT3(Y705)        | 4 P-STAT3     | BD           | 6240484          | Jurkats, PVO4 +/-           |
| 155  | Gd      | CD133               | AC133         | Miltenyi     | 130-090-422      | Jurkats, CaCo               |
| 156  | Gd      | CD10                | HI10a         | Biolegend    | 312202           | Jurkats, REH                |
| 157  | Gd      | SNAIL               | 20C8          | eBiosciences | 14-9859-82       | HCT116, NIH3T3              |
| 158  | Gd      | E-Cadherin          | 2.40E+11      | CST          | 3195BF           | Jurkats, OVCAR3             |
| 159  | Tb      | p-Akt (pS473)       | D9E           | CST          | 4060BF           | Jurkat, PVO4 +/-            |
| 160  | Gd      | Sox2                | 030-678       | BD           | 561469           | ESC, +/- LIF                |
| 161  | Dy      | cMYC                | D84C12        | CST          | 5605BF           | MEF, + DOX (Day 2)          |
| 162  | Dy      | pSTAT5(Y694)        | 47            | BD           | 6240484          | Jurkats, PVO4 +/-           |
| 163  | Dy      | Endoglin            | 43A3          | Biolegend    | 323202           | U937, HELA                  |
| 164  | Dy      | CD24                | ML5           | Biolegend    | 311102           | PBMCs, B vs T.              |
| 165  | Но      | p-Rb (pS807/811)    | J112-906      | BD           | 558389           | HCT116, Nocodazole +/-      |
| 166  | Er      | CD44                | BJ18          | DVS          | 3166001B         | PBMCs, T vs Monos           |
| 167  | Er      | PAX8                | polyclonal    | Abcam        | ab97477          | Jurkats, OVCAR3             |
| 168  | Er      | CD13                | L138          | BD           | 624084           | PBMCs                       |
| 169  | Tm      | p-CHK1 (pS345)      | 133D3         | CST          | 2348BF           | Jurkat, Etoposide +/-       |
| 170  | Er      | Non-phos β-Catenin  | D10A8         | CST          | 8480BF           | HCT116, 293 +/- LiCl        |
| 171  | Yb      | c-PARP (N214)       | 624084        | BD           | 624084           | Jurkat, 24hr Etoposide +/-  |
| 172  | Yb      | pS6 (pS235/pS236)   | N7-548        | BD           | 624084           | Jurkats, PMA +/-            |
| 173  | Yb      | Mesothelin          | MB-G10        | Rockland     | 200-301-A87      | OVCAR, HeLa                 |
| 174  | Yb      | pCREB (S133)        | 8763          | CST          | 9198BF           | Jurkat, PMA +/-             |
| 175  | Lu      | Total p53           | 1C12          | CST          | 2524BF           | Jurkat, Etoposide +/-       |
| 176  | Yb      | pHH3 (S28)          | HTA28         | Biolegend    | 641002           | HCT116 Cells +/- Nocodazole |

**Table 3: Tumor antibody Panel:** Antibodies from DVS were purchased as metal conjugates. All others were conjugated and titrated in the Nolan Lab.

#### dix A.

Multiple antibody clones were tested from different vendors, the details of which are given in **Table 3** (Tumor panel) and **Table 4** (Immune panel). Two exemplar titrations are shown for CD133, a stem cell surface marker (**Figure 1a**) and pH2AX, a transducer of DNA damage (**Figure 1b**), both critical components of ovarian cancer biology. Our complete sets of titrations are in **Appendix B and C** respectively.



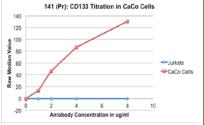


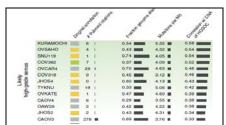
Figure 1a: The antibody concentration selected was 4  $\mu g/ml$  just at the plateau.

Figure 1b: The antibody concentration selected was 4  $\mu$ g/ml giving a signal to noise ratio of 80.

#### Acquisition of ovarian cancer cell lines

In a recent publication, a panel of 47 ovarian cancer cell lines from the Broad-Novartis Cancer Cell Line Encyclopedia (CCLE) were analyzed in order to identify those with highest genetic similarity to primary HG-SOC tumours 1, 19]. The study compared copy-number changes, mutations and mRNA expression profiles of with primary HG-SOC samples from The Cancer Genome Atlas (TCGA) database [20]. Unexpectedly, the findings revealed pronounced differences in molecular profiles between commonly used ovarian cancer-cell lines and HG-SOC tumor samples. Furthermore, several rarely used cell lines were identified that more closely resemble cognate tumor profiles than commonly used cell lines.

Therefore, we worked closely with the Japanese Collection of Research Biosources, part of the National Institute of Biomedical Innovation in Osaka, Japan, Public Health England, Fox Chase Cancer Center, and ATCC to procure 8 (KURAMOCHI, OVSAHO, COV362, OVCAR4, TYKNU (platinum-sensitive and resistant), OVKATE, CAOV3) of the 13 cell lines that feature as bearing the greatest similarity to primary HG-SOC tumors (Figure 2). We are acquiring SNU119 from Korea. These cell lines will always we included with any batch of primary HG-SOC tumor samples that are analyzed by mass cytometry.



**Figure 2** Cell lines with greatest similarity to primary HG-SOC [18, 19]. Figure taken from reference 18.

#### E. FUTURE PLANS

Over the past year, we have performed extensive validation of reagents and experimental procedures. Within the next year, we anticperforming ipate CyTOF analysis on 20 to 30 primary tumors (Indivumed) and 10 to 20 ascites that will be acquired at Stanford. We will determine both the tumor and infiltrating immune cell landscape.

For each primary tumor sample, IHC will be performed on FFPE samples prepared immediately post tumor resection with antibodies against CD45 (to gate immune

| Mass | Element | Antibody           | Clone         | Vendor      | Catalogue Number | Titration Cell Lines         |
|------|---------|--------------------|---------------|-------------|------------------|------------------------------|
| 113  | ln      | CD61               | VI-PL2        | BD          | 555752           | PBMCs, Mono/ CD4+            |
| 113  | In      | CD235ab            | HIR2          | Biolegend   | 306602           | Human Bone Marrow            |
| 115  | In      | HLA-DR             | L243          | Biolegend   | 307602           | PBMCs, B cells/ CD3+         |
| 139  | La      | CD45               | H130          | Biolegend   | 304002           | OVCAR3, PBMCs                |
| 141  | Pr      | CCR6               | G034E3        | DVS         | 31410034         | PBMCs, B cells/ CD4+         |
| 142  | Nd      | pMAPKAPK2 (pT344)  | 27B7          | CST         |                  | U937, TNFa +/-               |
| 143  | Nd      | pSTAT1 (pY701)     | 4a            | BD          | 624084           | Splenocytes, IFNa +/-        |
| 144  | Nd      | CD11b              | IRCF44        | DVS         | 3144001B         | PBMCs, Mono/ CD4+            |
| 145  | Nd      | CD4                | RPA-T4        | DVS         | 3145001B         | PBMCs, CD3+/ CD8+            |
| 146  | Nd      | CD8                | RPA-T8        | DVS         | 3146001B         | PBMCs, CD3+/ CD4+            |
| 147  | Sm      | p-H2AX (pS139)     | JBW301        | Millipore   | 05-636           | Jurkat, 4hr Etoposide +/-    |
| 148  | Nd      | CD123              | 6H6           | Biolegend   | 306002           | PBMCs, Mono/ CD3+            |
| 149  | Sm      | p-NFkB (pS529)     | K10-895.12.50 | BD          | 558393           | Jurkat, TNFa +/-             |
| 150  | Nd      | CD206              | 19.2          | BD          | 555953           | PBMCs, 72hr GMCSF +/-        |
| 151  | Eu      | pERK (pT202/pY204) | DA3.14.4E     | CST         | 4370BF           | U937, PMA+/-                 |
| 152  | Sm      | Ki67 (total)       | B56           | BD          | 556003           | HCT116, Nocodazole +/-       |
| 153  | Eu      | CD45RA             | HI100         | DVS         | 3153001B         | PBMCs, CD8 /CD45RO+/-        |
| 154  | Sm      | pSTAT3 (Y705)      | 4 P-STAT3     | 624084      | 624084           | Jurkat, PVO4 +/-             |
| 155  | Gd      | CD19               | HIB19         | BD          | 555410           | PBMCs, B cells/CD8+          |
| 156  | Gd      | BDCA2              | 201A          | Biolegend   | 354202           | PBMCs, pDCS/B cells          |
| 157  | Gd      | CD11c              | 3.9           | Biolegend   | 301602           | PBMCs, Mono/CD3+             |
| 158  | Gd      | CD33               | WM53          | DVS         | 3158001B         | PBMCs, Mono/CD14-            |
| 159  | Tb      | CCR7               | 150503        | R&D systems | MAB197-500       | PBMCs, CD8+/CD3-             |
| 160  | Gd      | CD14               | M5E2          | DVS         | 3160001B         | PBMCs, CD33+/-               |
| 161  | Dv      | CD66b              | G10F5         | Biolegend   | 305102           | Whole blood, CD45low/B cells |
| 162  | Dv      | pSTAT5 (Y694)      | 47            | 624084      | 624084           | Jurkat, PVO4 +/-             |
| 163  | Dv      | CXCR3              | G025H7        | Biolegend   | 353702           | PBMCs, B cells/NK cells      |
| 164  | Dv      | ICOS               | C398.4A       | Biolegend   | 313502           | PBMCs, CD8 24hr PMA/lono +/- |
| 165  | Ho      | CD16               | 3G8           | DVS         | 3165001B         | PBMCs, Mono/CD14-            |
| 166  | Er      | FoxP3              | PCH101        | Ebioscience | 14-4776-82       | PBMCs, CD4/CD8               |
| 167  | Er      | CD163              | GHI/61        | BD          | 556017           | PBMCs, Mono/CD3+             |
| 168  | Er      | CD68               | Y1/82A        | Biolegend   | 333802           | PBMCs, Mono/CD3+             |
| 169  | Tm      | CD25               | 2A3           | DVS         | 3169003B         | PBMCs, CD8 24hr PMA/lono +/- |
| 170  | Er      | CD3                | UCHT1         | DVS         | 3170001B         | PBMCs, CD14-/CD14+           |
| 171  | Yb      | cPARP (N214)       | F21-852       | BD          | 624084           | Jurkat, 24hr Etoposide +/-   |
| 172  | Yb      | pS6 (pS235/pS236)  | N7-548        | BD          | 624084           | Jurkat, PMA +/-              |
| 173  | Yb      | LAG-3              | N/A           | R&D systems | AF2319           | PBMCs, CD8 PMA/Iono +/-      |
| 174  | Yb      | pCREB (S133)       | 87G3          | CST         | 9198BF           | Jurkat, PMA +/-              |
| 175  | Lu      | PD1                | EH12.2H7      | DVS         |                  | PBMCs, 24hr PMA/Iono +/-     |
| 176  | Yb      | CD56               | NCAM16.2      | BD          |                  | PBMCs, CD3-/Mono             |

**Table 4: Immune cell antibody panel:** Antibodies from DVS were purchased as metal conjugates. All others were conjugated and titrated in the Nolan Lab.

and non-immune cell types, cPARP and cCaspase 3 (to determine the extent of apoptosis) and vimentin and E-cadherin to determine potential epithelial and mesenchymal compartments. Furthermore, a small aliquot will be evaluated by fluorescence-based flow cytometry which along with cell scatter properties will be compared with the IHC data. The remainder of the sample will be designated for CyTOF analysis with the two panels. Wherever possible, triplicates for each sample will be analyzed. These analyses are designed to serve four purposes:

- 1) Determine how comparable the sample being analyzed is to the tumor in situ
- 2) Enumerate the immune and non-immune component of each tumor sample
- 3) Landscape the surface phenotype and basal signaling states of the markers with potential information to be gained about: epithelial and mesenchymal cells as well as transitional EMT states (vimentin, ecadherin, endoglin, snail), TICs (NFkB, Sox2, Myc,  $\beta$ -catenin), cell of tumor origin (CA125 and mesothelin),
- 4) The immune cell landscape in terms of specific immune cell subsets within and between different tumor and ascites samples.

We are in regular contact with the Neel Lab to allow each group to incorporate relevant antibodies revealed their TIC studies. Efforts are also placed on improving the viability of cells post freezing in DMSO/serum. This allows us to expose viable cells to stimuli, such as cytokines, growth factors and drugs, capitalizing on past work from the Nolan Lab that demonstrated how the magnitude of an evoked response by a cell can be correlated with clinical features [21-24]

Additional CyTOF antibody panels will be built, based on what we learn from experiments in the Neel and Nolan labs, and also with emphasis on the stromal compartment.

#### F. KEY RESEARCH ACCOMPLISHMENTS

- Identification of stem-like clusters in 18/20 primary samples from the Neel/Nolan dataset
- Application of MONOCLE to look at cell neighborhoods (Pe'er lab)
- Identification and validation of Indivumed as a reliable source of high quality human specimens (supplies numerous Biotechs, Pharma and the NIH)
- Validation and optimization of ~ 80 antibodies that have been assembled into a "tumor" and "immune cell" panel
- Acquisition of relevant HG-SOC cell lines [18]

#### G. REPORTABLE OUTCOMES

#### **G.1a MANUSCRIPTS FUNDED BY THIS RESEARCH**

Bjornson, Z.B., G.P. Nolan, and W.J. Fantl, *Single-cell mass cytometry for analysis of immune system functional states*. Curr Opin Immunol, 2013. **25**(4): p. 484-94.

#### **G.1b ABSTRACTS AND PRESENTATIONS**

Nolan: European Congress of Immunology, September 5-8, 2012 From Immune-Monitoring to Health Policy – What is the Future?, Glasgow, Scotland

Nolan: From the laboratory to the clinic, September 10-13, 2012 A definable "structure" for the immune system and cancers at the single cell level, Trinity College, Oxford, England

Nolan: Scripps Research Institute Guest Speaker, January 17, 2013, A Systems Structure for Immunity and Cancer at the Single Cell Level, Jupiter Beach, FL

Nolan: CELLTech 2013, January 23, 2013, Single Cell Systems-Structured View of Immunity & Cancer, San Diego, CA

Nolan: Personalized Medicine World Congress, January 28-29, 2013, The Network as Symptom, Sentinel, Diagnostic & Target, Mountain View, CA

Nolan: 9th Spring School on Immunology, March 12-14, 2013, A Definable "Structure" for the Immune System and Cancers at the Single Cell Level, Ettal, Germany

Nolan: LINCS Data Forum, March 20-21, 2013, Without DEVIATION from the norm there can be no Evolution, Boston, MA

Nolan: American Association for Cancer Research Annual Meeting, April 7-10, 2013, A systems-level view of ovarian cancer and AML at the single cell level by mass cytometry, Washington, DC

Nolan: Karolinska Institutet, May 31, 2013, Mass Cytometry: Next generation flow cytometry, Stockholm, Sweden

Nolan: 3rd Annual Cambridge Stem Cell Institute International Symposium, July 8, 2013, Single Cell Systems Structure View of Stem Cells and Cancer Cambridge University, England

Nolan: Frontiers of Single Cell Analysis Conference, September 5-7, 2013, A single cell systems view of cancer and immunity, Stanford, CA

Fantl: Systems Medicine in Cancer, June 14-15, 2013 Deep Single Cell Profiling by Mass Cytometry, Langenbeck-Virchow-Haus Berlin

Fantl: Molecular Therapeutics of Cancer Gordon Conference, July 14 – 18, 2013 Deep Single Cell Profiling by Mass Cytometry, Boulder, Colorado

Neel: Advances in Ovarian Cancer Research, AACR, September 18 – 21' 2013 Analyzing the Cellular Basis for Heterogeneity in Serous Ovarian Carcinoma, Miami, FL

#### **G.2 LICENSES APPLIED FOR AND/OR ISSUED**

N/A

**G.3 DEGREES OBTAINED OR SUPPORTED BY THIS AWARD** 

N/A

**G.4 DEVELOPMENT OF CELL LINES, TISSUE OR SERUM REPOSITORIES** 

N/A

G.5 INFORMATICS SUCH AS DATABASES AND ANIMAL MODELS, etc.

All data from these studies is available on Cytobank.org

**G.6 FUNDING APPLIED FOR BASED ON THIS AWARD** 

N/A

G.7 EMPLOYMENT OR RESEARCH OPPORTUNITIES APPLIED FOR AND/OR RECEIVED BASED ON EXPERIENCE/TRAINING SUPPORTED BY THIS AWARD

N/A

#### H. CONCLUSION

The preliminary data have identified: i) the experimental variables to be addressed ensuring rigor and consequently confidence in understanding the biology of the disease (rather than experimental artifacts) ii) a new algorithm identified potential stem-like cell subsets in a preliminary study with primary samples. This critical information has been incorporated into the design of the upcoming experiments. Thus addressing the point of "so what", we are set to carry out studies on high quality viable HG-SOC single cells prepared from clinically annotated samples where the parameters measured at the single-cell level will provide critical information about the disease and actionable steps to benefit patients.

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### Appendix A —

Single-cell mass cytometry for analysis of immune system functional states

Zach B Bjornson, Garry P Nolan and Wendy J Fantl



#### **ScienceDirect**



# Single-cell mass cytometry for analysis of immune system functional states

Zach B Bjornson, Garry P Nolan and Wendy J Fantl

Mass cytometry facilitates high-dimensional, quantitative analysis of the effects of bioactive molecules on cell populations at single-cell resolution. Datasets are generated with panels of up to 45 antibodies. Each antibody is conjugated to a polymer chelated with a stable metal isotope, usually in the lanthanide series of the periodic table. Antibody panels recognize surface markers to delineate cell types simultaneously with intracellular signaling molecules to measure biological functions, such as metabolism, survival, DNA damage, cell cycle and apoptosis, to provide an overall determination of the network state of an individual cell. This review will cover the basics of mass cytometry as well as outline assays developed for the platform that enhance the immunologist's analytical arsenal.

#### Addresses

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Fluorescence-based flow cytometry has proven an invaluable technology for both immunologists and clinicians alike [1]. Importantly, it provides crucial biological information at the single-cell level regarding ploidy, immunophenotype, frequency of cell subsets, expression levels of proteins, as well as functional characterization [2–7]. Furthermore, the potential of this technology can be significantly extended by interrogating single cells not only in their basal state but also after their exposure to exogenous stimuli. The latter has given rise to fluorescence-based phospho-flow cytometry, which has enabled determination of the activity of intracellular pathways [8,9°,10,11,12°,13°,14°,15,16,17]. Interrogated revelation of cellular states is key to the mechanistic understanding of the immune system perturbed during disease, and to elucidating the positive or negative effects on signaling pathways wherein cells have been exposed to

therapeutic and potential therapeutic agents in vitro or in vivo [14°,18–20].

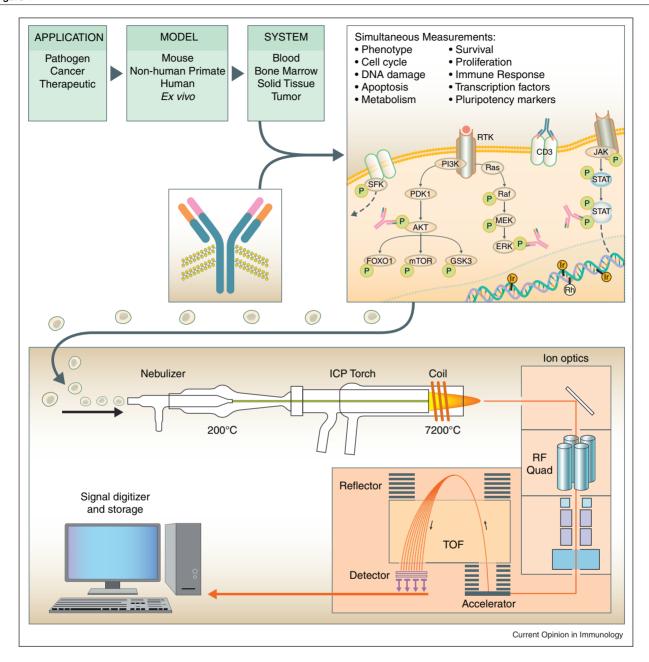
However, as powerful as fluorescence-based flow cytometry can be, it falls somewhat short of uncovering the well-recognized complexity of the immune system when determined simultaneously with intracellular network states. The primary drawback of traditional fluorescence-based flow cytometry is ironically the same tool that has enabled it to be so useful for nearly three decades: the number of markers that can be simultaneously analyzed is inherently limited by spectral overlap. Measurement beyond three fluorophores becomes more complex as more parameters are added, involving corrections for spectral overlap as well as appreciation for the auto-fluorescence of certain cell types [21,22]. Even with such corrections and understanding, the practical limit of flow cytometry is about ten markers wherein significant training or effort is involved in designing such panels. Investigation of intracellular pathways under such restrictions is unwieldy, since the bulk of the parameters for a fluorescence-based analysis will be assigned to surface markers that call out specific cell types, leaving only a few channels to measure phosphorylation states or levels of intracellular proteins. So where do we go from here?

A new generation of single-cell analysis technology called mass cytometry overcomes most of these limitations (Figure 1). The CyTOF (Cytometry by Time Of Flight) is a mass spectrometer-flow cytometer hybrid instrument that uses stable isotopes instead of fluorophores as reporters [23,24,25,26,27,28°,29,30]. Mass cytometry offers a number of significant advantages compared to fluorescence-based applications. Of foremost importance, due to their discrete readouts, use of isotopes as reporters enables a significant increase in the number of measurable parameters per cell. Furthermore, the platform is quantitatively accurate with linear sensitivity across four orders of magnitude. Further advances such as increased numbers of deployable isotopes, novel nano-crystal configurations and computational tools promise to extend mass cytometry well into the 'omics' arena and provide system-wide views of immune function in healthy donors and patients suffering from infection, inflammation or cancer.

#### Basic concepts of mass cytometry

To address the limitation of traditional fluorescencebased cytometry, namely the number of simultaneously

Figure 1



Mass cytometry enables high-dimensional analysis of diseases and therapeutic responses. Diseases including cancer and infections perturb cellular signaling. Mass cytometry provides a readout for up to 52 simultaneous measurements, of both disease-induced perturbations and importantly of counter-perturbations induced by candidate therapeutics. Furthermore, the simultaneous inclusion of cell phenotype and cell cycle provide a more detailed picture than possible before. After cells are stained with antibodies and other metallic assay reagents, they are introduced into the mass cytometer as a stream of single cells, then atomized and ionized as they pass through the inductively coupled plasma (ICP) torch. Low-mass elements (including carbon and nitrogen) are filtered out by a radio frequency quadrupole before entering the time-of-flight (TOF) detector. A high-speed, online analysis system produces data equivalent to that of traditional fluorescence-based cytometry.

measured parameters, Scott Tanner and colleagues at the University of Toronto embarked upon a remarkable adaptation of inductively coupled plasma mass spectrometry (ICP-MS). ICP-MS is routinely used in the mining, metallurgy and semi-conductor industries and is the method of choice for measuring the elemental components of materials since it can detect the contamination of, for example, blood with lead and drinking water with arsenic, beryllium or heavy metals. In ICP-MS, samples are vaporized, atomized and ionized in plasma at temperatures approximating that of the surface of the sun (7500 K). The mass spectrometer can then resolve and quantify Tanner and colleagues realized that incorporating such attributes into flow cytometry might dramatically increase the number of parameters that could be measured per single cell. They reasoned that, rather than being conjugated to fluorophores, antibodies could be conjugated to stable metal isotopes, such as lanthanides, that are absent or at low abundance in biological systems, and then adapt ICP-MS instrumentation for their detection at single-cell resolution [23,27,31–33]. This was the foundational concept upon which the mass cytometer was developed.

By tagging each antibody with a unique lanthanide isotope, the readout from each isotope can be correlated with a particular antibody, which in turn can be correlated to levels of antigen associated with an individual cell. Thus, the number of simultaneously measurable parameters per cell is now only limited by the number of stable isotopes suitable for conjugating to antibody reagents. For this to be accomplished, two fundamental technical challenges needed to be overcome. One was to develop reagents to tag antibodies with stable metal isotopes. Another was to adapt the ICP mass spectrometer to simultaneously detect multiple isotope tags, in the form of an ion cloud, associated with a single cell event.

In many respects the workflow for a mass cytometry experiment is analogous to traditional flow cytometry (Figure 1). By taking advantage of a long history of fluorescence-based innovations, it has been possible to 'recreate' the assays of many reagents with isotopelabeled tags. These adaptations as well as novel assays specific to mass cytometry will be outlined below.

### Attaching metal-chelating polymers to antibodies

For the attachment of multiple atoms of a given isotope to a selected antibody, acrylic acid polymers were synthesized with a uniform number polymer units and functionalized with multiple copies of a chelator, such as 1,4,7,10-tetraazacyclododecane-1,4,7,10-tetraacetic acid (DOTA) or diethylene triamine pentaacetic acid (DTPA), compatible with the chemistry of trivalent metal lanthanide ions [34]. The resultant chelated lanthanide has a  $K_d$  of  $10^{-16}$  and is therefore nearly impervious to losses or exchanges between other chelated metals within an antibody panel. A terminal maleimide group on the polymer permits its conjugation to selectively reduced disulfide groups in the hinge region of the immunoglobulin heavy chain.

Typically four to five polymers bind to each antibody, with each polymer chain capable of carrying up to 30 metal isotopes [32,34]. The first and current generation of isotope-chelating polymers can bear up to 120 lanthanide

ions per antibody molecule [34]. That, combined with the level of ion transmission at 1 in 10,000, means the lower limit of detection for any given cellular parameter is about 300–1000 target protein copies (comparable to many fluorophores by traditional fluorescence). Unlike photomultiplier tubes in photon-driven cytometry which can show non-linear sensitivity across the dynamic range, the sensitivity of the ICP-MS readout is linearly proportional to the number of elemental isotopes conjugated to each antibody. Nevertheless, the sensitivity of lanthanide-conjugated antibodies is currently about two-fold lower than the brightest fluorophores such as phycoerythrin. This will likely be overcome with new modalities that are under investigation to increase the number of metal isotopes linked to an individual antibody [35,36].

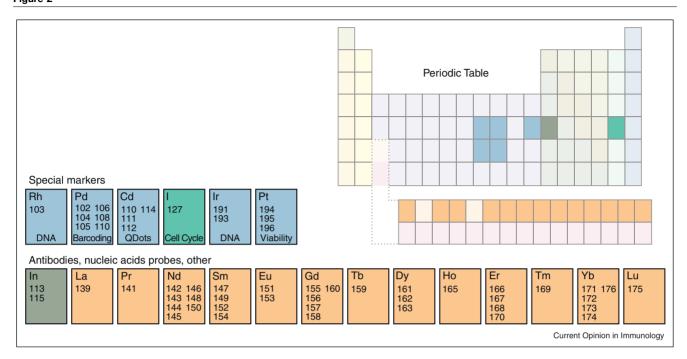
As will be discussed below, the lanthanides dominate as the group of metals compatible with current polymer tag chemistries. However, in order to expand the number of simultaneously measureable parameters, new chelation chemistries are under development with the aim of including isotopes with oxidation states other than +3, such as the noble metals. Their atomic mass falls within the range suitable for mass cytometry and could thus increase the panel of metal-tagged antibodies available for single-cell analysis by 20 or more.

## Assigning stable metal isotopes to measurements of cellular parameters

At present, a total of 37 purified, stable lanthanide isotopes are available and compatible with the metal chelating polymer chemistry (Figure 2). Of those, 27 are available at enrichment purities above 97 percent; the rest are available at enrichment purities above 92 percent. Care must be taken when assigning antibodies to isotopes to ensure that impurities in other channels do not result in false-positives during analysis. Additionally, certain metals are prone to oxidation, which results in signal in other channels. For example, measurements of gadolinium 157 are prone to interference from +16 oxidation of praseodymium 141. In addition to the lanthanides, indium, a post-transition metal, has two isotopes that are compatible with the chelating chemistry, but their sensitivity is low and thus only suitable for detection of highly abundant proteins, such as CD45 expressed on leukocytes. One additional parameter can be measured with quantum dots (O-dots) using the cadmium that is their major constituent.

Given the absence of light scatter properties to record a cell event, measurement of rhodium or iridium DNA intercalators, as well as a cell event-induced ion cloud duration measurement ('cell length') can be used to demarcate cells in terms of their DNA content and approximate size, respectively [26,32]. A variety of other measurements (viability, cell cycle and multiplexing barcode reagents) are discussed below, bringing the total

Figure 2



A large number of metals are available for a variety of measurements. The lanthanides provide 37 stable isotopes for measuring antigen-bound antibodies, MHC tetramers and nucleic acid probes with high sensitivity. Indium provides two low-sensitivity channels for highly expressed markers, and quantum dots provide one additional channel (cadmium). Rhodium and iridium, as DNA intercalators, register a cell event. Platinum, in the form of cisplatin:sulfur complexes, is used as a viability marker. Iodine, as iodo-deoxyuridine, is used for cell cycle measurements. Six palladium isotopes allow for mass tag 'barcoding' and multiplexed measurement of samples.

number of quantifiable parameters for a single cell to 52. It might be possible in the future to measure forward and side scatter before introduction of each cell into the ICP-MS plasma. Likewise, it might be possible to sort cells by cleaving the reporter elements from the cells before introduction into the plasma and using those readouts to trigger a standard cell sorter.

#### Adapting ICP-MS to measuring single-cell ion clouds

It was necessary to adapt the ICP-MS to retain the temporal information of a multi-ion cloud derived from a single cell [23,31,32]. As with conventional ICP-MS, liquid samples, but now containing a cell suspension, are nebulized into single-cell droplets, rapidly dried in a heated spray chamber and then delivered into the central channel of the 7500 K argon plasma where they are vaporized, atomized and ionized to create clouds of ions that correspond to the cells. The ion cloud derived from a single cell has a measurement span of approximately 200– 300 microseconds. Therefore, in order to measure the composition of each cloud fully, a fast and simultaneous mass analyzer is required. This ruled out the use of quadrupole and magnetic sector mass analyzers because they detect one isotope at a time and require 200 microseconds or more to switch between measured isotopes. Instead, a time of flight (TOF) analyzer was used. This measures the complete mass spectra 'simultaneously' in 13 microsecond pulses and captures the entire cohort of ions derived from a single cell over the 200-300 microsecond ion cloud duration. This restricts sample throughput to 1000 cells per second.

#### Developing the mass cytometry tool kit

Of fundamental importance is the observation that fluorescence and mass cytometry yield very comparable results when analyzed by traditional 2D flow plots, histograms and heat-maps [37\*\*,38\*\*]. Yet there are clear differences between the two platforms. Although the deep dive into a single cell at the level of greater than 45 parameters provides an unprecedented level of detail unavailable by fluorescence, the latter platform efficiently determines measures of, for example, cellular calcium and reactive oxygen species, for which as yet there are no mass cytometry equivalents. However, over the past year a number of new reagents have been created for mass cytometry that can now be incorporated into the 'tool kit' as discussed below.

#### Data normalization with bead standards

As with any quantitative technology, there is a stringent requirement for internal and external reagent standards for data normalization. In the case of mass cytometry, crucially, variation in instrument performance can be caused by factors such as instrument calibration, fluctuations in plasma and build-up of cellular debris in the sample introduction components. In order to normalize for these factors, polystyrene beads infused with precise amounts of several lanthanide isotopes are acquired simultaneously with every sample. A multiplicative correction derived from the bead signature is now routinely applied to the raw mass cytometry data before any further analysis takes place [39°]. The software for its implementation is available at www.cytobank.org/nolanlab.

### Increasing throughput and decreasing variability by mass tag barcoding

Amine-reactive fluorescent dyes, such as Pacific Blue, Alexa Fluor 488, Alexa Fluor 700 and Alexa Fluor 750 each attached to N-hydroxysuccinimidyl (NHS) ester, can be used in different combinations for fluorescence 'barcoding' of separate samples that are subsequently pooled, stained in a single tube with a fluorescently-tagged antibody panel and analyzed simultaneously on a flow cytometer. Data are then deconvoluted according to the fluorescent barcode signatures of the component samples [40]. There are three significant advantages to sample barcoding: (i) all samples are stained in the same tube with the same antibody mix, eliminating cell-to-antibody ratio-dependent effects on staining, (ii) reduced antibody consumption and (iii) increased sample throughput.

These principles can apply to barcoding reagents available for mass cytometry (mass cell barcoding). In a recent study, metal barcode reagents were prepared by chelating lanthanides with a bifunctional macrocyclic compound, maleimido-mono-amide-DOTA (mDOTA), which labels cells by covalent attachment to intracellular thiol groups. Samples were labeled with a unique binary combination of seven mDOTA-lanthanide reagents, multiplexed and deconvoluted to accurately recover samples with given barcodes. This foundational study lends support to the use of metal barcoding reagents in mass cytometry [41\*\*]. Unlike fluorescence-based cytometric analysis, a fluidics purge lasting several minutes is required between sample introductions on the mass cytometer. The throughput gained by barcoding is thus particularly significant. As a refinement of the barcoding reagents used in the published study, the mDOTA-lanthanides have now been replaced with six palladium isotopes. These have masses (102-110) below that of the smallest lanthanide and therefore do not occupy channels that can otherwise be used for metal-tagged antibodies (E. Zunder, G. Behbehani, R. Finck, C. Thom, G. Nolan manuscript in preparation).

#### **Cell viability determinations**

A large set of fluorescence-based reagents exists with which to measure cell viability. They operate on the principle that a compromised cell with a damaged plasma membrane permits reagent entry into the cytoplasm, whereas a healthy cell with an intact plasma membrane does not. Specifically, reagents are available that: (i) intercalate non-covalently into DNA (e.g. 7-aminoactinomycin D (7-AAD) or propidium iodide) [42,43], (ii) covalently attach to DNA (TdT dUTP nick end labeling (TUNEL) [44] (iii) covalently attach to proteins (Invitrogen Fixable LIVE/DEAD1) [45], and (iv) monitor alterations in mitochondrial membrane potential (differences in fluorescence of the monomeric and aggregate forms of 5,5',6,6'-tetrachloro-1,1',3,3' tetraethylbenzimidazolylcarbocyanine iodide (JC-1)) [46]. Similarly, a variety of reagents is available for determination of cell viability by mass cytometry and operates under the same principles as fluorescent reagents, albeit with a different readout. These include rhodium and iridium-containing metal-intercalators [26] and an amine-reactive chelator, 1,4,7,10-tetraazacyclododecane-1,4,7,10-tetraacetic acid mono (N-hydroxysuccinimide ester) (DOTA-NHS-ester) [38°°]. Recently, a protocol was described for using cisplatin to determine cell viability [47°]. Although well known as a chemotherapeutic agent because of its ability to form extremely stable DNA-platinum adducts, cisplatin has an alternative activity in which it reacts on a much more rapid timescale (minutes as opposed to days) with protein thiols, forming covalent platinum-sulfur bonds. Furthermore, in an independent study, acrylamide polymers bearing platinum or palladium recognized nonviable cells [48]. Platinum has six stable isotopes, of which three are dominant (194, 195 and 196 Da) and well separated from the lanthanides, making cisplatin an ideal reagent for determinations of cellular viability by mass cytometry.

#### Measuring the cell cycle by mass cytometry

No biological evaluation would be complete without including measurements of cell cycle phase. An abundance of fluorophore-based reagents have been used for decades to stage cells on the basis of their DNA content using traditional flow cytometry. Included in the list are supra-vital stains in the Hoechst group, such as 4',6-diamidino-2-phenylindole (DAPI) that bind to A-T-rich regions within the minor groove of DNA, or membrane-impermeable reagents such as propidium iodide and bromo-deoxyuridine [3,49]. These fluorescent stains can all be used with a limited number of antibodies that characterize a specific cell cycle phase.

In a recent study, Behbehani *et al.* designed a panel of metal-chelated antibodies with which to perform a comprehensive analysis of the cell cycle progression machinery [37\*\*]. The panel included antibodies against cyclins, phosphorylated retinoblastoma (Rb), phosphorylated Cdk1, phosphorylated histone H3 and Ki67 to denote cells in cycle covering the G0, G1, G2 and M phases. Of its many roles, retinoblastoma is pivotal for cell cycle progression, with a complex mechanism defining its role

in G1 to S progression [50,51]. However, the antibody used here was against an epitope encompassing residues pS807 and pS811, which are substrates for cyclin C/Cdk3 and are necessary for quiescent cells to enter into cycle [52]. To identify cells in S phase, multiple studies have used halopyrimidines (bromo-deoxyuridine, iodo-deoxyuridine and chloro-deoxyuridine) which become incorporated into newly synthesized DNA. Antibodies recognizing these groups necessarily require a DNA denaturation step to gain access to the modified site [53,54]. However, iodo-dexoyuridine, without an accompanying antibody, can be measured directly by mass cytometry: the incorporated iodine in the newly synthesized DNA has an atomic mass of 127, which falls within the requisite range for mass cytometry. Its inclusion in the panel gave a direct and clear measure of the percentage of S-phase cells which was also beneficial in increasing the resolution between the G1 and G2 phases.

Using a variety of cancer cell lines, cycling T lymphocytes and primary human bone marrow, Behbehani et al. identified all cell cycle phases with a core panel: p-Rb (pS807/ S811), IdU, cyclin B and p-Histone H3 (pS28). Importantly, the cell cycle phases were validated in side-by-side measurements by fluorescence flow cytometry [37°]. The importance of this study lies in the ability to now measure many other biological parameters within the context of the cell cycle. For example, signaling, DNA damage, and metabolic pathways can now be examined at defined phases in the cell cycle (G. Behbehani, W. Fantl, G. Nolan, S. Lowe, P. Mallik, unpublished). In the area of infectious disease, vaccinia, influenza and hepatitis C virus infections are all known to alter cell cycle progression [55–58]. Conversely the host cell cycle affects the replication of viruses such as Ebola virus, in which case the virus depends on actively proliferating host cells for replication itself [59]. This core marker set would be equally significant in the development of therapeutic agents, many of whose activities are known to be influenced by cell cycle state [60-64].

#### Measurements of cytokines: regulators of immune cell subsets and beyond

Traditional flow cytometry has greatly benefited from single-cell measures of cytokine activity. The cytokine superfamily includes interleukins, chemokines, colonystimulating factors, interferons, as well as the transforming growth factor and tumor necrosis factor families, all with a large array of diverse biological functions. They have well-described functions in innate immunity (inflammation, chemotaxis, allergy, macrophage and NK cell activation) as well as in adaptive immunity (cellular and humoral) [65–72]. However, cytokines are now known to be produced by and mediate their effects on cells other than immune cells and have been implicated in the pathologies of, for example, cancer, stroke and pulmonary arterial hypertension [73–75].

Thus, given their far-reaching effects in multiple tissues, defining cellular phenotypes based on their cytokine expression is another essential parameter to include in the mass cytometry toolkit. Fluorescence-based flow cytometry protocols have measured cytokine production in a variety of T cell subsets [76–79]. Recently, mass cytometry applied to CD8+ T cells after stimulation with anti-CD3, anti-CD3/anti-CD28 or PMA/ionomycin has remarkably revealed there to be about 200 distinguishable subtypes based on the combinatorial diversity of the nine functional attributes, with even greater diversity revealed when taking into account different expression patterns of surface markers [80\*\*]. This study has set the stage for measuring the functional diversity of both immune and non-immune cell subsets.

#### Major histocompatibility class-peptide tetramers conjugated to metal-chelating polymers

Antigen-specific T cell subsets are generated when their T cell receptors interact with pathogen-derived peptidemajor histocompatibility complexes expressed on antigen presenting cells [81]. At a given moment, there will be numerous T cell subsets throughout the body with different antigen specificities. However, their low frequency and low affinity interaction of their receptor with peptidebound MHC precluded a detailed characterization of their properties. To circumvent this problem, Altman and Davis constructed a peptide-MHC tetramer in which four identical biotinylated MHC-peptide molecules were complexed with streptavidin conjugated to a fluorophore, resulting in increased avidity [82]. The peptide-MHC complex only binds to the specific T cells that respond to that peptide. The tetramer can then be detected by flow cytometry via the fluorescent label [82,83]. Recently, the fluorophore on streptavidin was replaced by a metalchelating polymer allowing a multidimensional analysis to be performed by mass cytometry with a panel of cytokine antibodies as described above. In this way it was possible to identify 56-106 combinations of functional attributes for several viral-specific T cell subsets, revealing a far more complex view of the cytokine network than seen before [80°°].

#### Building panels of thirty-something antibodies for deep proteomic profiling

One undisputed advantage of single-cell mass cytometry is the ability to measure multiple parameters on a singlecell basis, without the need to compare smaller panels or computationally join data files from separate smaller antibody panels [5,7]. As mentioned above, most isotopes are assigned to antibodies, as they are at the crux of the mass cytometry 'tool kit.' As with any antibody, the conditions for their use must be optimized. The key steps are conjugation to the metal-containing polymer and performing the appropriate titrations to measure signal-to-noise ratios (also referred to as 'stain index').

Panels can be designed with up to 45 antibodies focused completely on surface markers to delineate cellular hierarchy, or a combination of surface markers and intracellular signaling molecules. The latter are focused on the activation states of intracellular signaling pathways. This approach has provided new information about established cell types, as well as previously unidentified cell types revealed by new combinations of surface markers. In addition to providing an increased understanding of the immune system, mass cytometry can also provide new information about solid tumors. Using appropriate protocols to dissociate tumors [84,85] into their constituent single cells, new cellular hierarchies have been revealed in ovarian cancer (J. Stewart, B. Neel, B. Bodenmiller, W. Fantl and G. Nolan, unpublished). This increased level of detail regarding signaling potential at the single-cell level, regardless of the tissue of derivation, provides a new backdrop for drug discovery.

### Deep proteomic profiling of the human immune system

The first deep proteomic study evaluated signaling responses in specific immune cell subsets within the hematopoietic continuum [28°,38°]. Two panels each comprising 31 metal polymer-conjugated antibodies were assembled. The 'phenotypic panel' was designed to measure surface molecules expressed on immune cell subsets, and successfully identified known and distinct immune cell subsets, including B, T, NK and DC cells and monocytes. However, transitional cells were also seen, not previously captured in prior studies, but that are consistent with an immune continuum rather than abrupt conversions to distinct differentiation stages. The second panel maintained 13 surface marker antibodies from the first panel but had an additional 18 intracellular signaling molecules representing the activation status for a number of pathways. Human bone marrow was treated with twenty extracellular modulators including growth factors, cytokines, chemokines and three small molecule kinase inhibitors (dasatinib, Jak1 inhibitor and the U0126 Mek inhibitor). Thus, Ras/Raf/Erk, NF-κB, p38/MAP-KAPK2, STATs 1, 3 and 5, CREB and BCR signaling were all included and measured simultaneously [38\*\*]. Using Spanning-tree Progression Analysis of Densitynormalized Events (SPADE, discussed in more depth below) signaling responses were seen within tight cellular boundaries as well as across multiple immune cell types. This system-level view is the first in a series of studies to generate a human immune reference map as a resource for therapeutic and vaccine studies (Z. Bjornson, G. Fragiadakis, M. Spitzer, M. Davis, G. Nolan, unpublished).

This foundational study also demonstrated a paradigm for multi-dimensional analysis of complex primary tissues, namely establishing a phenotypic hierarchy using surface markers and then selecting a subset of surface marker antibodies to combine with antibodies that measure activated intracellular signaling molecules. Since then, many additional antibody panels have been optimized to interrogate a broad variety of cellular functions including: receptor tyrosine kinase signaling, epithelial-mesenchymal transition, the Wnt pathway, apoptosis, survival, proliferation, DNA damage response, cell cycle, metabolism, embryonic stem cells and induced pluripotent stem cells. The value of this technology platform is in its ability to measure multiple cellular functions, which will be invaluable for understanding disease states. However, it is first necessary to have the tools to analyze high-dimensional data.

### Analyzing high-dimensional mass cytometry data

Although mass and fluorescence-based flow cytometry use entirely different instrumentation, the data from both platforms provide equivalent information [37°,38°]. However, there are several notable differences in the data. In fluorescence cytometry, significant background signals arise from spectral overlap and auto-fluorescence, the natural fluorescence of cellular structures. In mass cytometry, because 'auto-mass' does not exist, there is minimal background and consequently less spread around zero. Nonetheless, in both cases, a transformation such as the inverse hyperbolic sine function is typically applied to compress values around zero, resulting in a more coherent negative population (one that lacks a marker of interest). However, the standard transformation used with mass cytometry data does not compress the data as strongly as standard transformations for fluorescence data, resulting in data that is truer to the measured signal (Fig. S2 in [38°°]).

We and others have adapted a variety of algorithms to the analysis of high-dimensional, single-cell mass cytometry data. One obvious choice for processing large datasets is clustering, the grouping of similar cells, which has been applied extensively to microarray data [86,87]. One of the first algorithms developed to analyze mass cytometry data was SPADE [38\*\*,88\*\*,89]. It uses hierarchical, agglomerative clustering after performing density-dependent downsampling in an effort to preserve rare cell types that would otherwise be drowned out by far more frequent cell types. The resulting clusters can be placed into a minimum-spanning tree [38\*\*], or into a more highly connected graph with a force-directed layout (E. Zunder and G. Nolan, manuscript in preparation).

Automatic determination of known, biologically relevant clusters is still a difficult problem in flow cytometry data analysis because it is difficult to determine the edge of where one cell population begins and the other ends. This is an especially difficult problem when one considers

transitions and progressions where cells dynamically exist along a framework of cell states. On the one hand, under-segmentation results in clusters containing multiple cell types whereas on the other hand, oversegmentation needlessly divides homogenous cell types. In a new approach, over-segmentation of cell subsets and their subsequent merging by affinity propagation resulted in larger, biologically relevant cell subpopulations [90] (T. Chen, M. Clutter et al., in submission). This technique works especially well for analyzing continuous progressions of cells, such as the cell cycle, where manual demarcation of cell subsets is difficult.

Recently, viSNE, a visualization tool for high-dimensional single-cell data based on the t-distributed stochastic neighbor embedding (t-SNE) algorithm [91,92], was applied to mass cytometry datasets from healthy and leukemic bone marrow [93]. viSNE generates a two-dimensional map that reflects the proximity of cells to one another in high-dimensional space. This approach works well but is currently unable to process a large number of cells. One established statistical tool, principle component analysis (PCA), has also been applied to mass cytometry datasets. It derives summary variables to capture as much variation as possible in as few terms as possible to aid visualization [94]. This technique has successfully been applied to CyTOF data [38°,80°]; however, its ability to fully separate many distinct cell populations remains limited.

#### Summary and conclusions

Reiterating a central theme of this essay, we have discussed how mass cytometry can be applied to advance traditional flow cytometry assays. Although mass cytometry, as it stands with panels of 45 parameters in routine use, provides a level of detail about protein function not previously possible, further improvements are needed. These include increased sensitivity, changes in the instrumentation to increase sample flow rate and to reduce sample loss as well as new computational tools. Regardless, multi-dimensional, single-cell mass cytometry is currently positioned to have dramatic consequences on drug development and therapeutic programs for multiple indications ranging from infectious disease, cancer, inflammatory conditions and trauma.

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Appendix B —

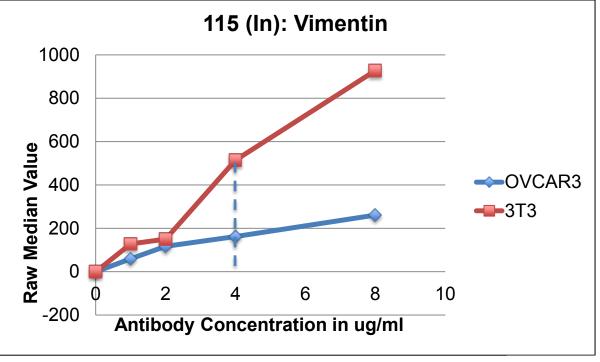
**Titration Slides for Tumor Panel** 

# **OVCAR Tumor Panel 1 – Metal assignation**

| In113 | Not used          |
|-------|-------------------|
| In115 | Vimentin          |
| La139 | CD45              |
| 140Ce | Not used          |
| Pr141 | N-cadherin        |
| Nd142 | Cleaved-caspase 3 |
| Nd143 | CA125             |
| Nd144 | CD90              |
| Nd145 | pAMPK(T172)       |
| Nd146 | pATM(S1981)       |
| Sm147 | pH2AX(S139)       |
| Nd148 | Cyclin B1         |
| Sm149 | p65Rel-A(S529)    |
| Nd150 | pBcl-2(S70)       |
| Eu151 | pErk(T202Y204)    |
| Sm152 | Ki67 (total)      |
| Eu153 | Chk2(T68)         |
| Sm154 | pSTAT3(Y705)      |
| Gd155 | CD133             |
| Gd156 | CD10              |

| Gd157 | SNAIL                 |
|-------|-----------------------|
| Gd158 | E-Cadherin            |
| Tb159 | pAkt(473)             |
| Gd160 | Sox2                  |
| Dy161 | Myc                   |
| Dy162 | pSTAT5(Y694)          |
| Dy163 | Endoglin              |
| Dy164 | CD24                  |
| Ho165 | pRb(S807/811)         |
| Er166 | CD44                  |
| Er167 | PAX8                  |
| Er168 | CD13                  |
| Tm169 | pChk1(S345)           |
| Er170 | Non-phospho-β-catenin |
| Yb171 | cleaved-PARP          |
| Yb172 | prpS6(S235/236)       |
| Yb173 | Mesothelin            |
| Yb174 | pCREB(S133)           |
| Lu175 | p53 (total)           |
| Yb176 | pHH3(S28)             |
|       |                       |

Blue – surface
Green- transcription
Red – DDR cell cycle
Purple – signaling
Orange - apoptosis
Italics – ovarian-specific



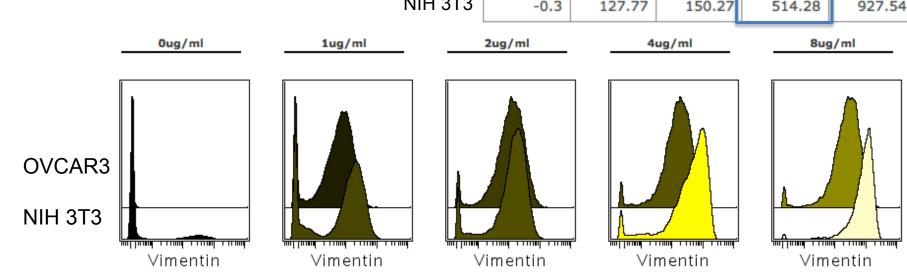
# 115 (In): Vimentin

Date Conjugated: 7/22/13

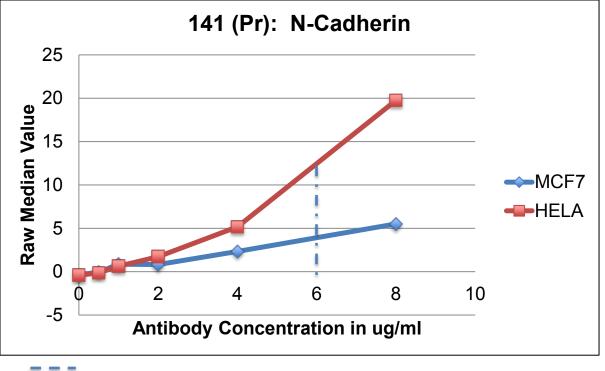
**Titration: 8/16/13** 

CST 5741BF Clone: D21H3

| Selected Conc. : 4ug/ml | 0ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|-------------------------|--------|--------|--------|--------|--------|
| OVCAR3                  | -0.43  | 59.38  | 117.34 | 161.87 | 260.84 |
| NIH 3T3                 | -0.3   | 127.77 | 150.27 | 514.28 | 927.54 |



# Cd45 on 139 from immune panel



# 141 (Pr): N-Cadherin

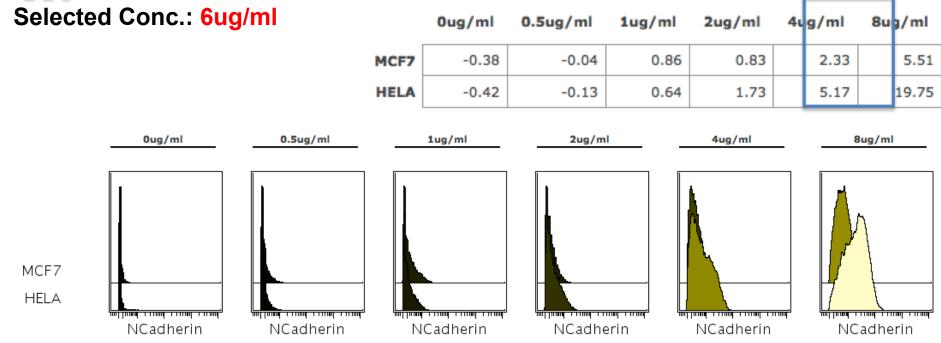
Date Conjugated: 9/26/13

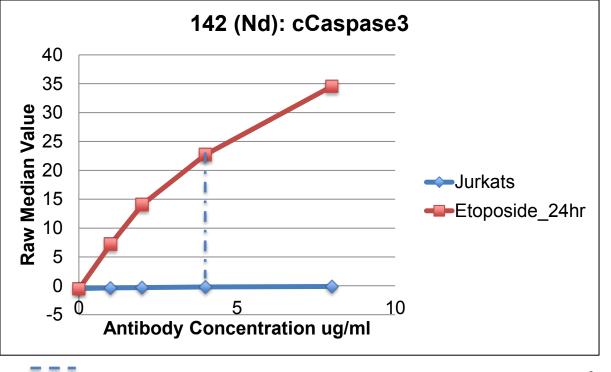
6µg

Titration: 10/10/13

BD 561553

Clone: 8C11





# 142 (Nd): cCaspase3

Date Conjugated: 2/12/2013

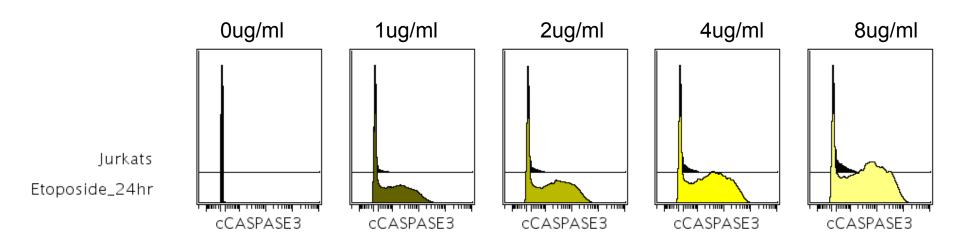
Titration: 3/8/13

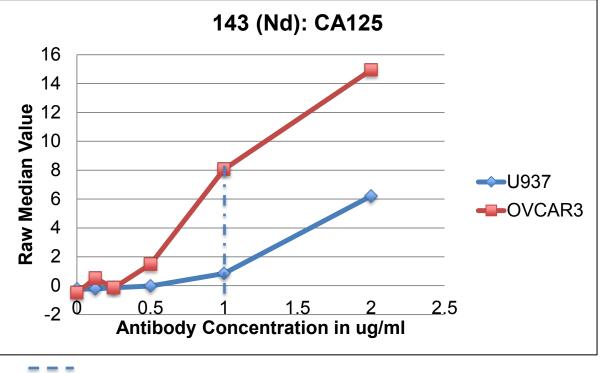
BD 624084

Clone: C92-605

Selected Conc.: 4ug/ml

0ug/ml 1ug/ml 4ug/ml 8ug/ml 2ug/ml Jurkats -0.47-0.37-0.3-0.21-0.1222.71 34.55 -0.537.19 14.04 Etoposide\_24hr





# 143 (Nd): CA125

Conjugated: /9/2013

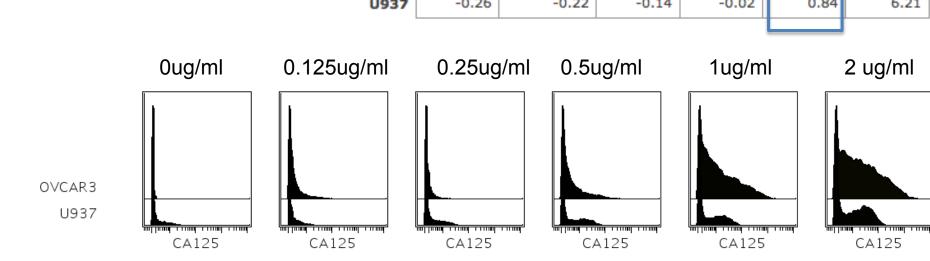
Titration: 8/28/13

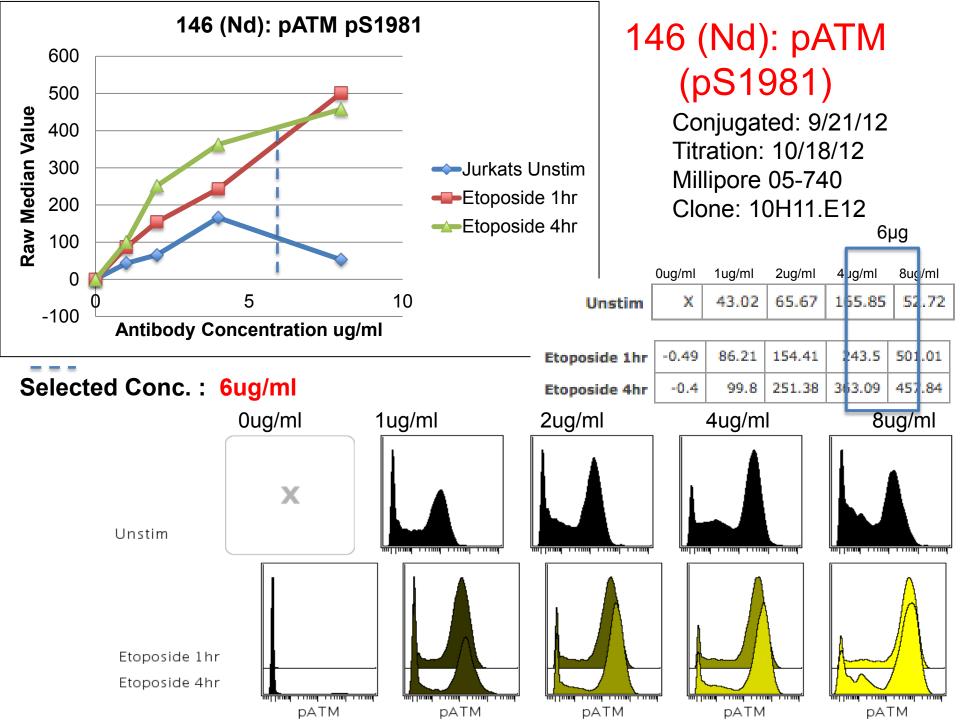
GenWay GWD-17DD7A

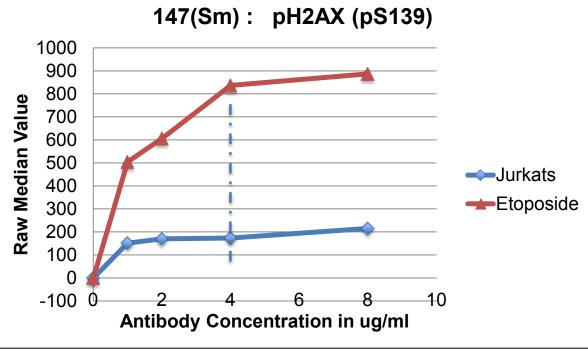
Clone: X75 (3C8/4)

### Selected Conc. : 1ug/ml







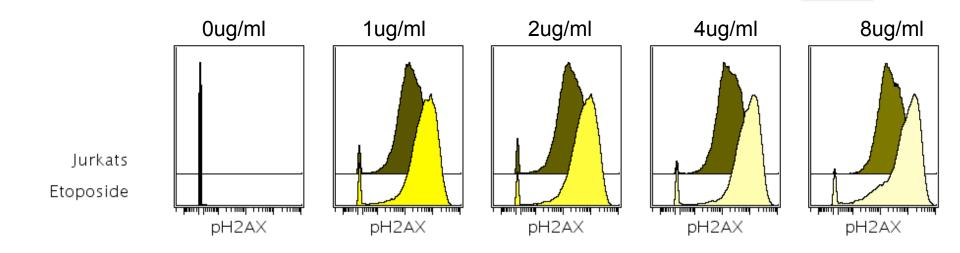


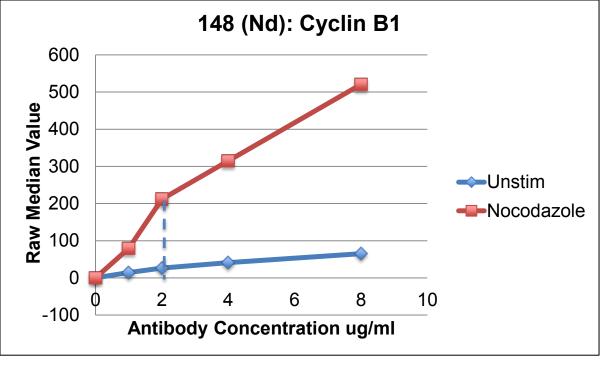
# 147 (Sm): pH2AX (pS139)

Date Conjugated: 2/13/13

Titration: 2/14/13 Millipore 05-636 Clone: JBW301

|                         | ]     |        |        |        |        |        |  |
|-------------------------|-------|--------|--------|--------|--------|--------|--|
|                         | C     | )ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |  |
| Selected Conc. : 4ug/ml | rkats | -0.5   | 150.98 | 169.84 | 173.41 | 214.81 |  |
| Etopo                   | oside | -0.49  | 504.49 | 605.9  | 836.7  | 887.14 |  |
|                         |       |        |        |        |        |        |  |





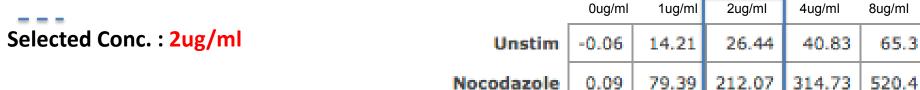
# Nd (148): Cyclin B1

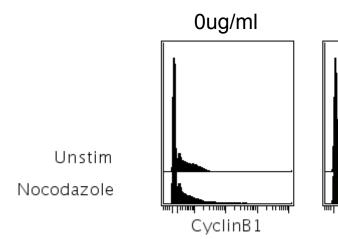
Conjugated: 9/19/12

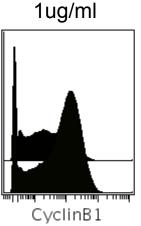
**Titration:** 10/3/12

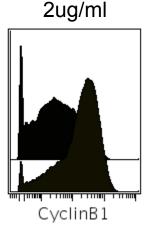
BD 554176

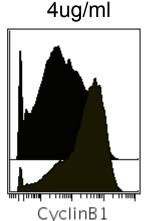
Clone: GNS-1

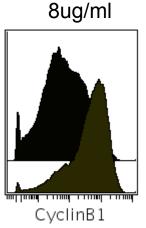


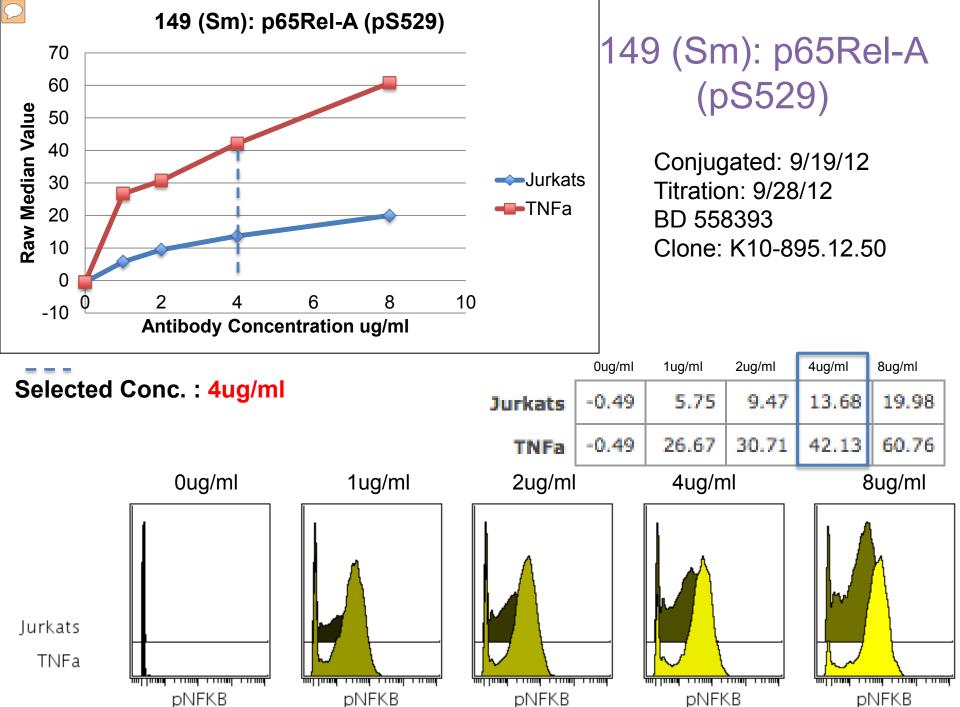


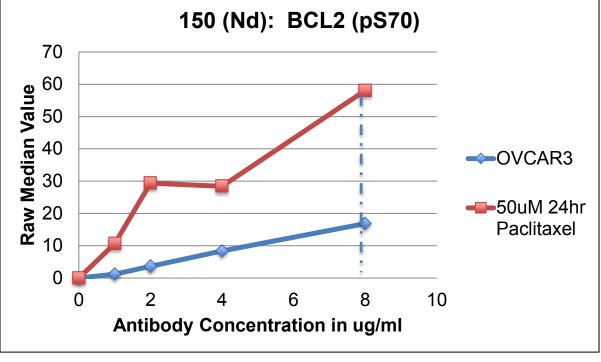












# 150 (Nd): pBCL2 (pS70)

Conjugated: 5/7/2013

**Titration: 5/10/13** 

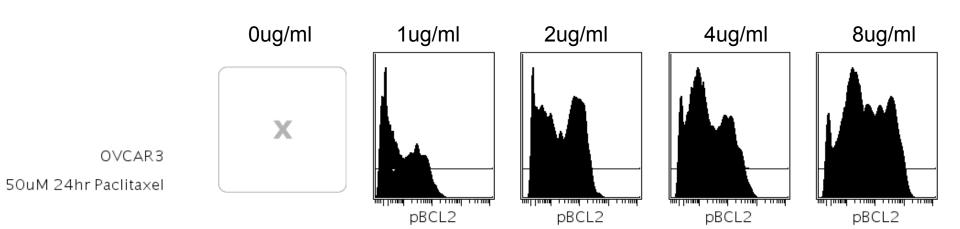
CST 2827

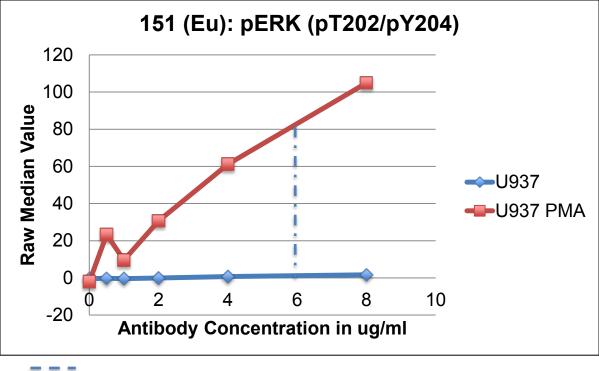
Clone: 5H2

Selected Conc.: 8ug/ml

OVCAR3
50uM 24hr Paclitaxel

| 0ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|--------|--------|--------|--------|--------|
| х      | 1.23   | 3.63   | 8.39   | 16.84  |
| 6.02   | 10.65  | 29.39  | 28.4   | 58.08  |





# 151 (Eu): pERK (pT202/pY204)

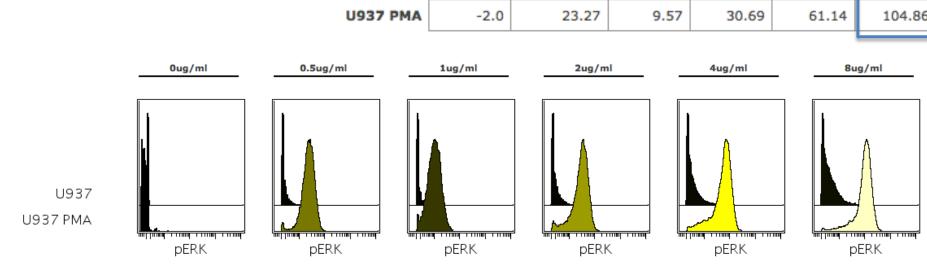
Date Conjugated: 2/12/2013

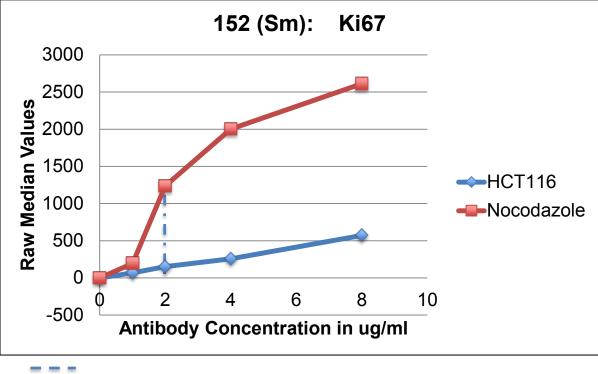
Titrated: 10/01/2013

BD 624084 Clone: 20A

#### Selected Conc.: 6ug/ml

|          | 0ug/ml | 0.5ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|----------|--------|----------|--------|--------|--------|--------|
| U937     | -0.43  | -0.2     | -0.38  | -0.08  | 0.69   | 1.63   |
| U937 PMA | -2.0   | 23.27    | 9.57   | 30.69  | 61.14  | 104.86 |
|          |        |          |        |        |        |        |





## 152 (Sm): Ki67 Total

Conjugated: 3/15/2013

8ug/ml

The state of the s

Ki67

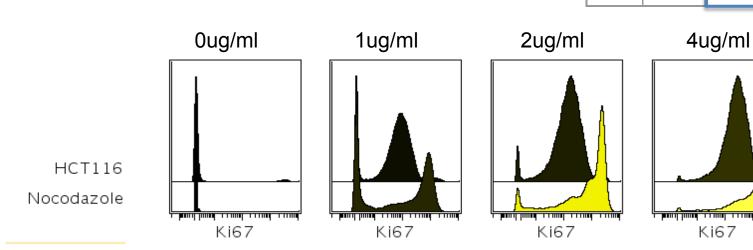
**Titration: 3/21/13** 

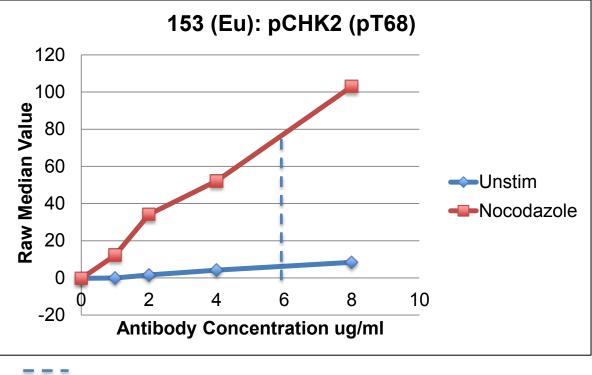
BD 556003

Clone: B56



0ug/ml 1ug/ml 2ug/ml 4ug/ml 8ug/ml -0.3767.89 151.33 256.66 571.46 **HCT116** Nocodazole 194.5 1235.78 2001.93 -0.492611.07





## 153 (Eu): pCHK2 (pT68)

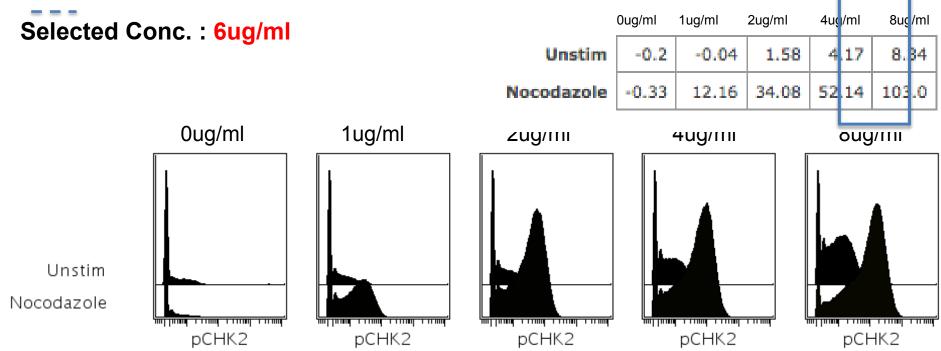
Conjugated: 9/21/12

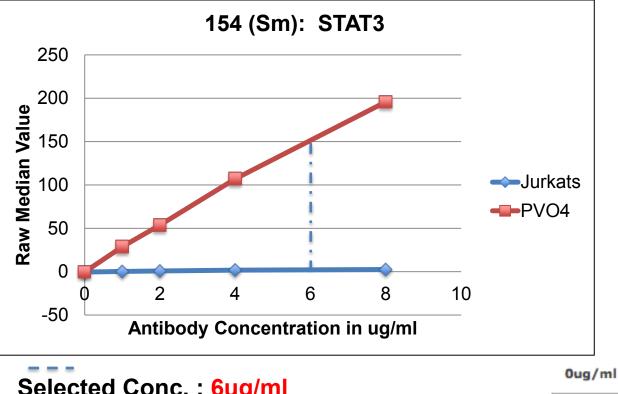
6µg

Titration: 10/3/12

CST 2661

Clone: C13C1





## 154 (Sm): pSTAT3

Date Conjugated: 7/16/13

**Titration: 8/16/13** 

2ug/ml

0.93

53.75

BD 624084

Clone: NA

1ug/ml

0.36

28.87

-0.35

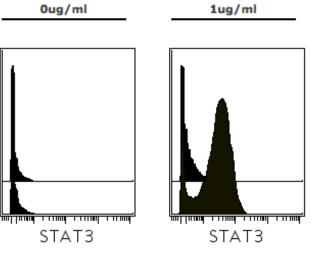
-0.33

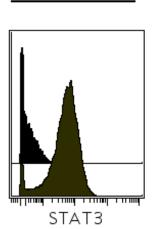


Jurkats

PV04

Oug/ml

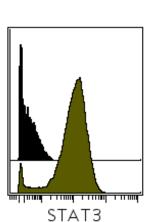




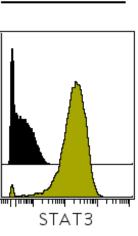
Jurkats

PVO<sub>4</sub>

2ug/ml



4ug/ml



8ug/ml

6µg

8ug/ml

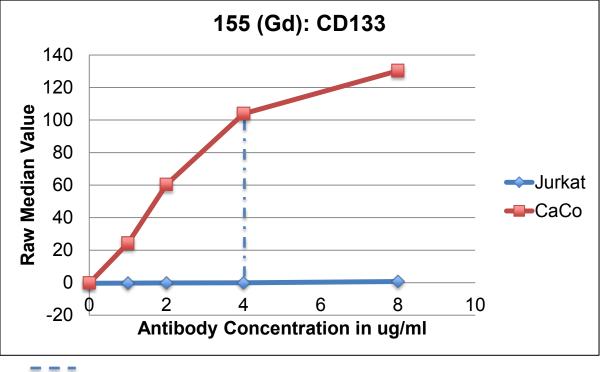
2.48

195.9

4ug/ml

.69

107.17



### 155 (Gd): CD133

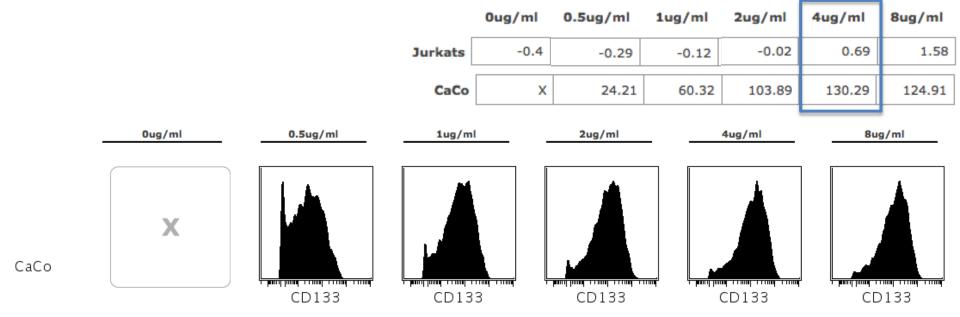
Date Conjugated: 7/22/13

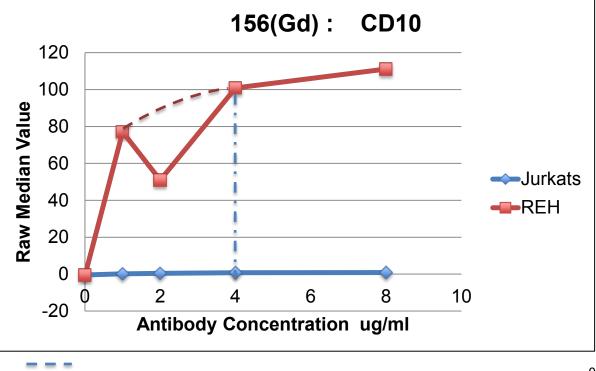
**Titration: 9/10/13** 

Miltenyi 130-090-422

Clone: AC133

#### Selected Conc. : 4ug/ml



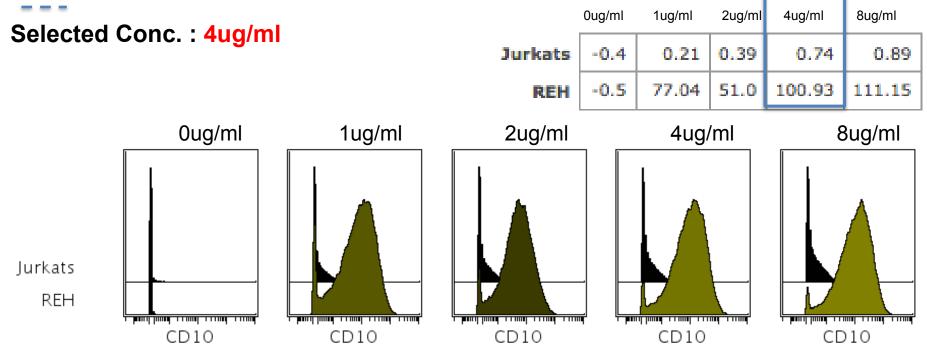


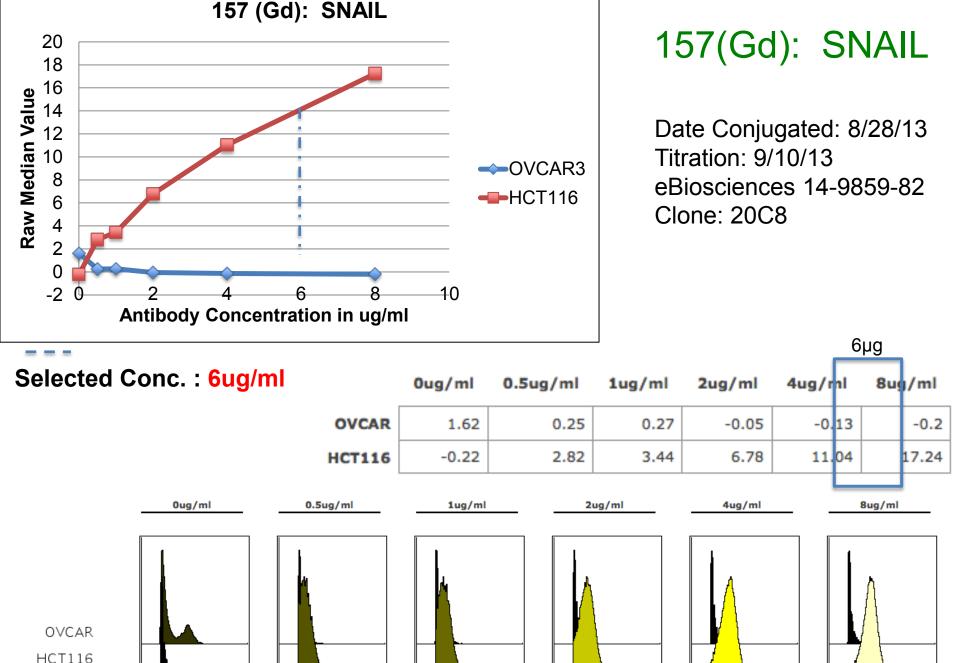
## 156 (Gd): CD10

Date Conjugated: 2/13/2013

Titration 2/26/13 Biolegend 312202

Clone: HI10a





SNAIL

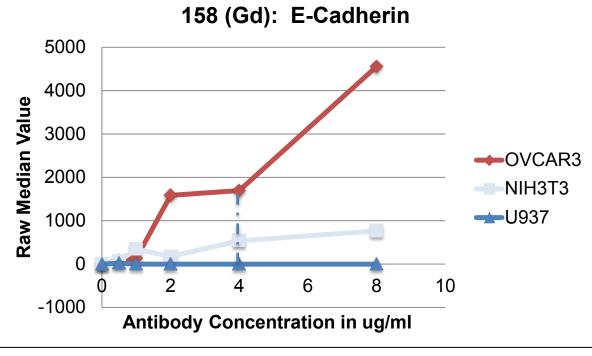
SNAIL

SNAIL

SNAIL

SNAIL

SNAIL



Ecadherin

OVCAR3

**NIH 3T3** 

U937

Ecadherin

## 158 (Nd): E-Cadherin

Date Conjugated: 7/16/13

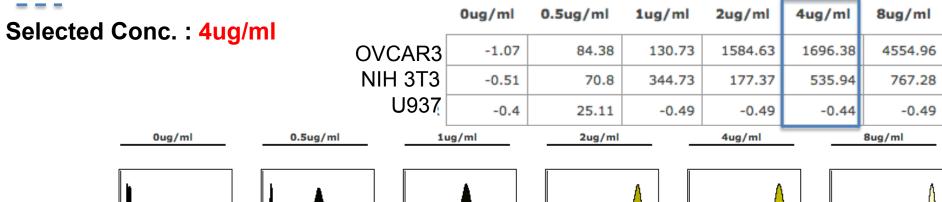
Titration: 9/24/13

**CST 3195BF** 

Clone: 2.40e11

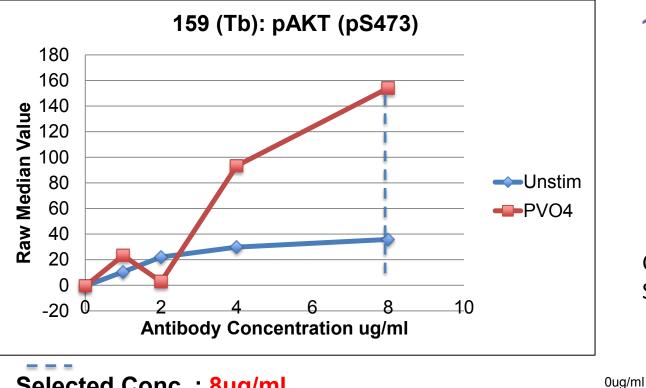
Ecadherin

Ecadherin



Ecadherin

Ecadherin



# 159 (Tb): pAKT (pS473)

Conjugated: 9/21/12 Titration: 10/18/12

CST 4060 Clone: D9E

1ug/ml

10.49

23.35

-0.49

-0.49

Cell Line: Jurkat Cells

2ug/ml

22.07

2.81

Stim: 125uM PV04 for 10min

4ug/ml

29.8

93.27



Unstim

Pervanadate

0ug/ml

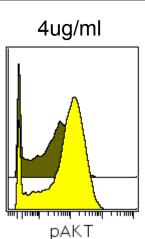
pAKT

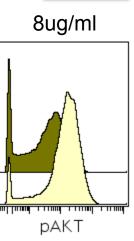
Pervanadate

1ug/ml

pAKT

| 2ug/ml   |   |  |
|----------|---|--|
|          |   |  |
|          |   |  |
|          |   |  |
| <u> </u> |   |  |
| pAKT     | • |  |



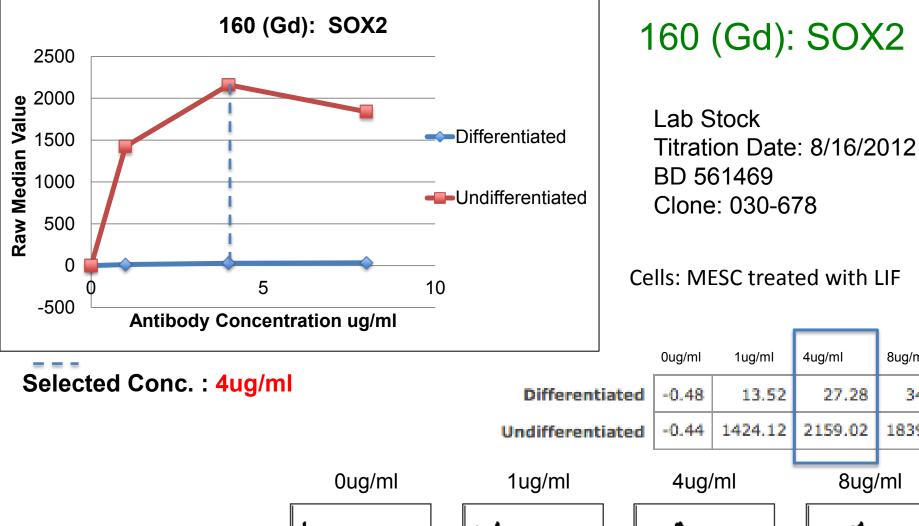


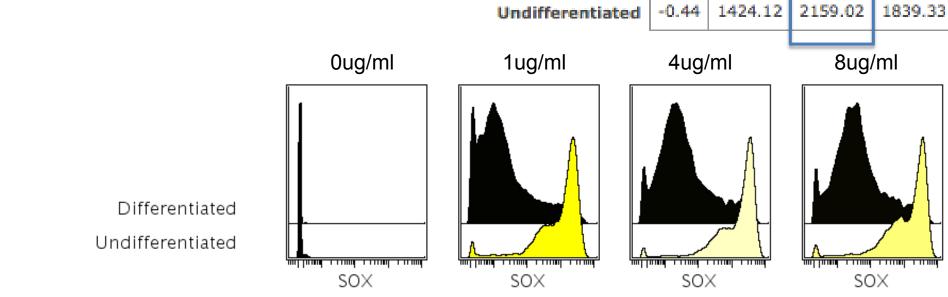
8ug/ml

35.8

154.08

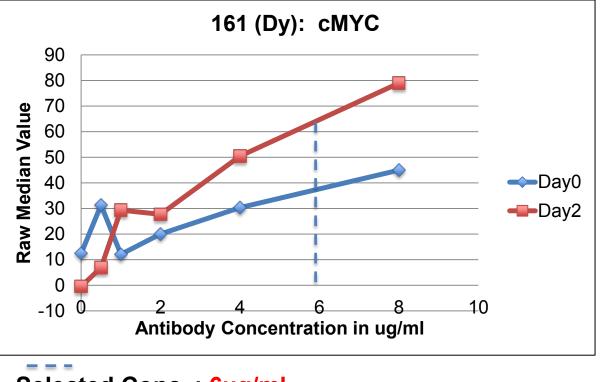
Unstim





8ug/ml

34.29



### 161 (Dy): cMYC

Date Conjugated: 8/28/13

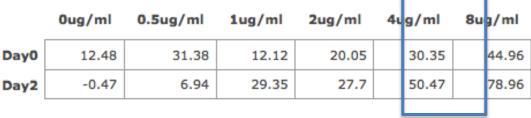
Titration: 9/10/13

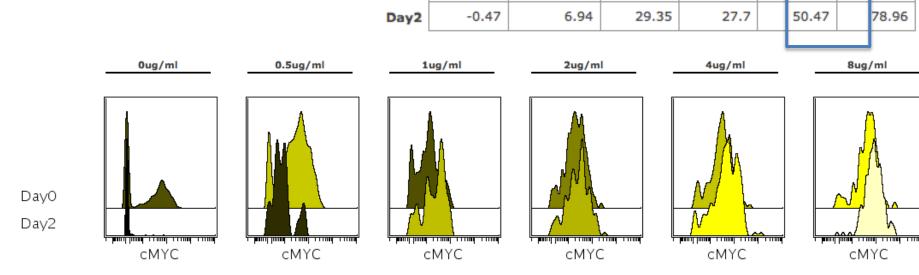
**CST 5605BF** 

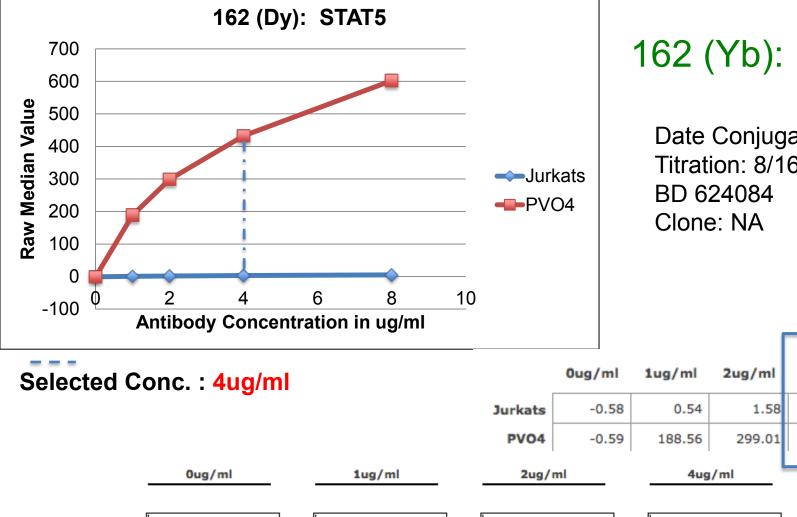
Clone: D84C12

Cells: MESC treated with LIF 6µg

Selected Conc. : 6ug/ml







STAT5

STAT5

Jurkats

PV04

STAT5

## 162 (Yb): pSTAT5

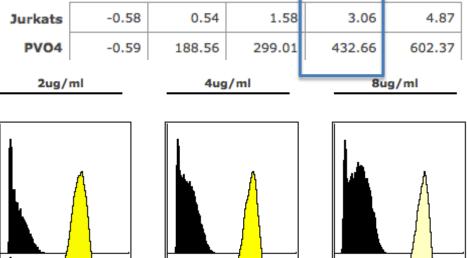
Date Conjugated: 7/16/13

4ug/ml

8ug/ml

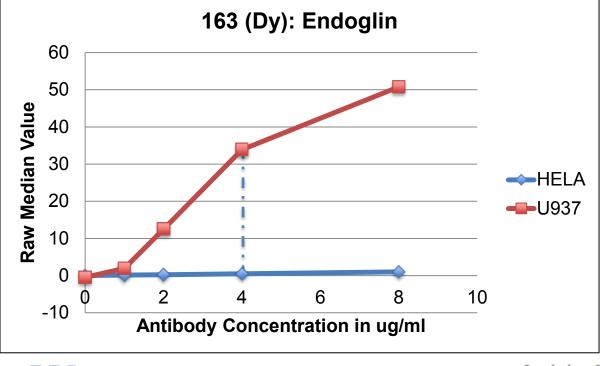
STAT5

Titration: 8/16/13



THE PERSON NAMED IN TAXABLE PARTY OF THE PERSON NAMED IN TAXABLE PARTY OF TAXABLE PARTY OF

STAT5



## 163 (Dy): Endoglin

Conjugated: 8/28/13

Titration: 9/3/13

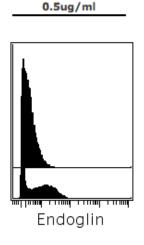
Biolegend 323202

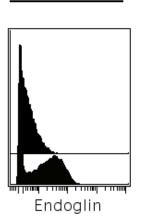
Clone: 43A3

| Selected | Conc.          | : | 4ua/m   | ĺ |
|----------|----------------|---|---------|---|
| Coloctoa | <b>O</b> 0110. | • | Tag/III | • |

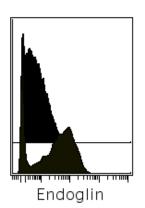
Oug/ml 0.5ug/ml 4ug/ml 8ug/ml 1ug/ml 2ug/ml -0.411.64 1.94 4.78 9.86 16.05 Hela U937 -0.461.96 12.48 33.87 50.76 105.78

|      | Oug/ml      |
|------|-------------|
|      |             |
|      |             |
|      |             |
|      |             |
|      |             |
|      |             |
| Hela |             |
| U937 |             |
| 4    | <del></del> |
|      | Endoglin    |
|      |             |

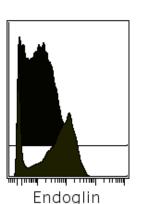




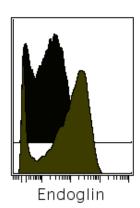
1ug/ml



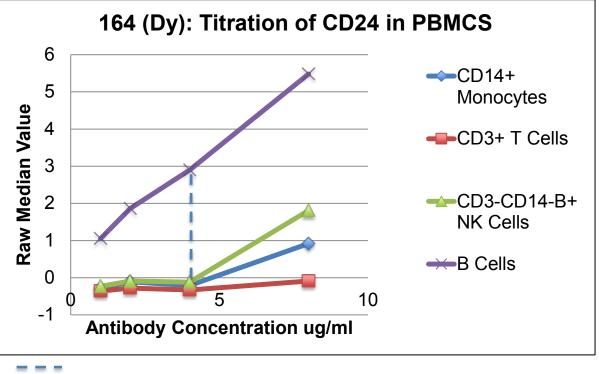
2ug/ml



4ug/ml

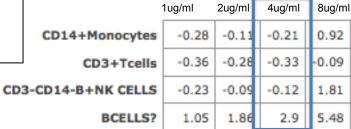


8ug/ml

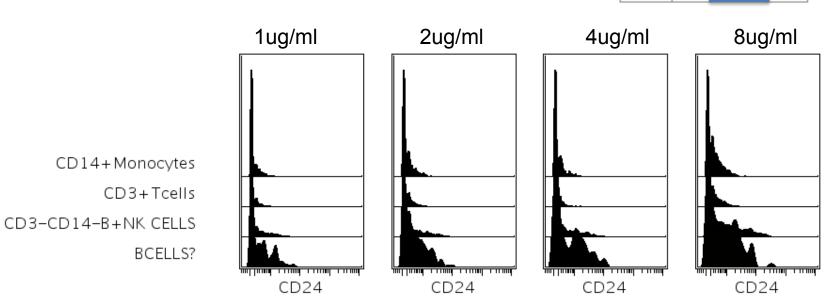


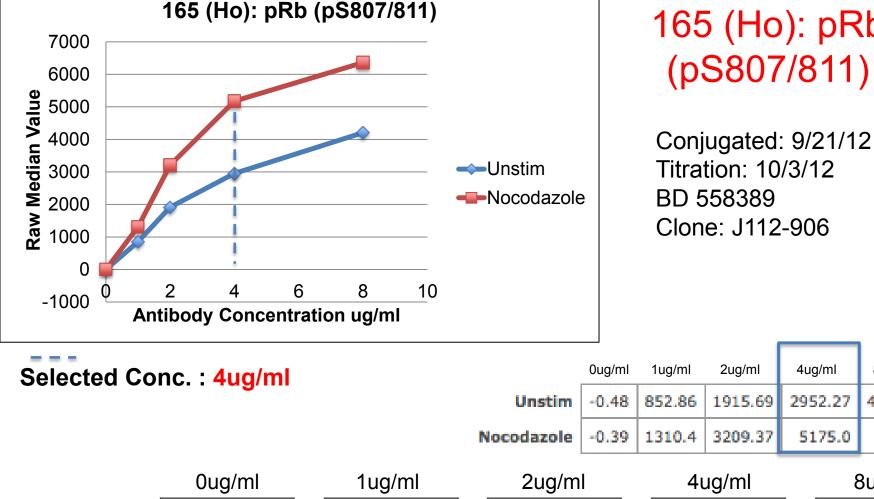
164 (Dy): CD24

Lab Stock
Titration Set 1
8/21/2012
Biolegend 311102
Clone: ML5



Selected Conc. : 4ug/ml





pRb

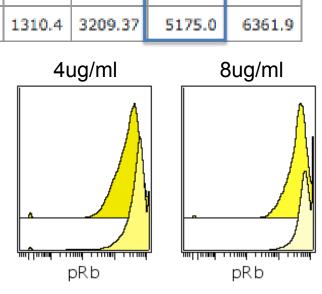
pRb

Unstim

pRb

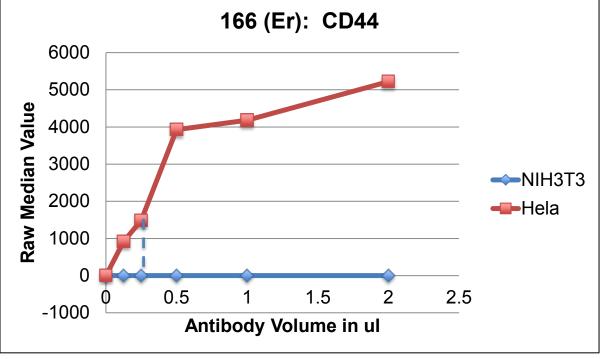
Nocodazole

## 165 (Ho): pRb (pS807/811)



8ug/ml

4209.32

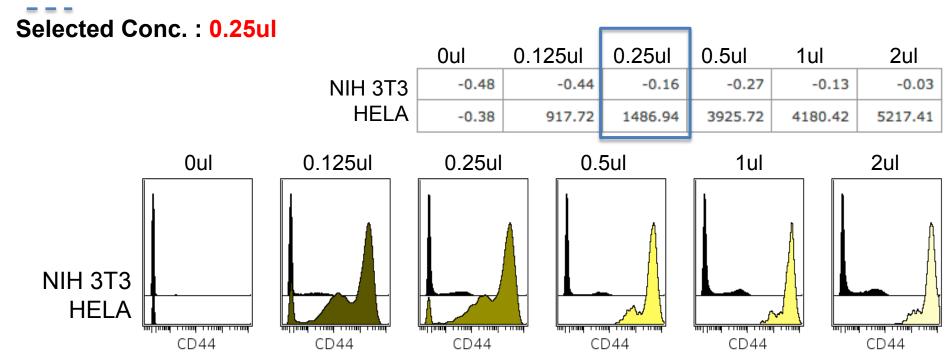


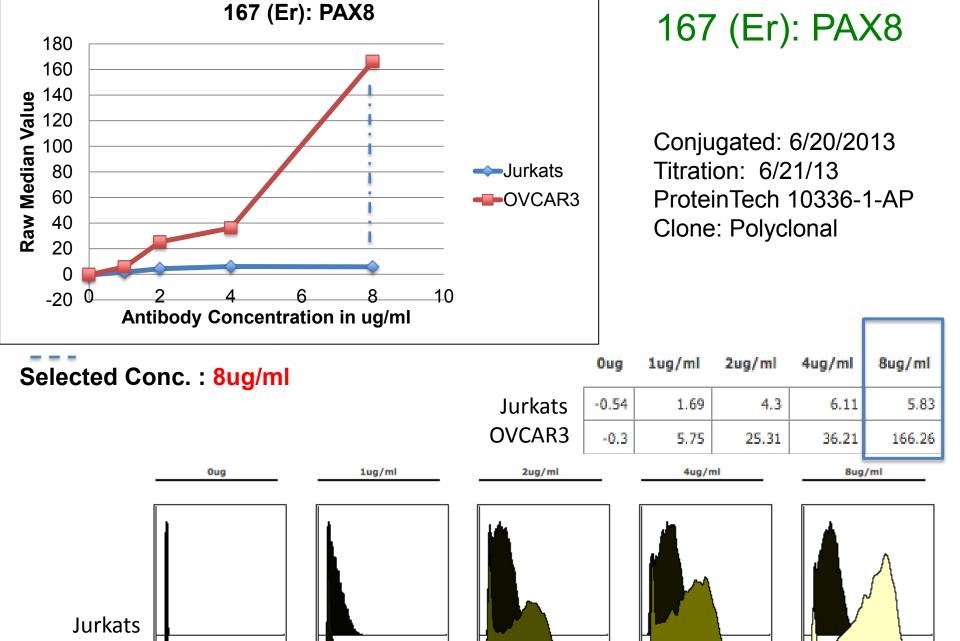
### 166 (Er): CD44

Date Conjugated: DVS

Titration: 9/24/13 DVS 3166001B

Clone: BJ18





PAX8

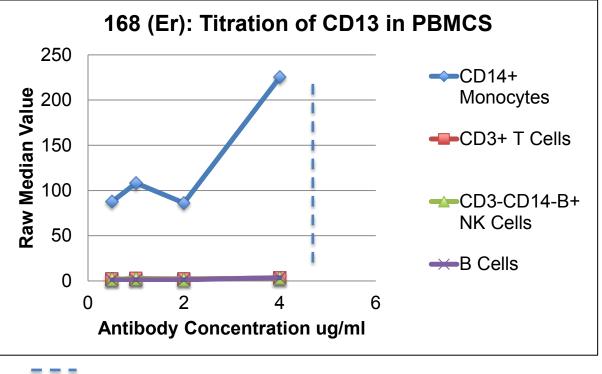
PAX8

PAX8

**OVCAR3** 

PAX8

PAX8



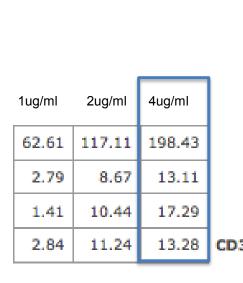
### 168 (Er): CD13

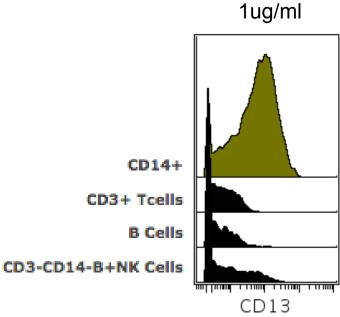
Conjugated: 9/21/12

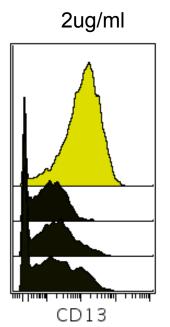
Titration: 10/3/12

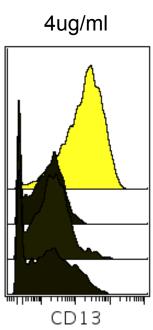
BD 624084 Clone: L138

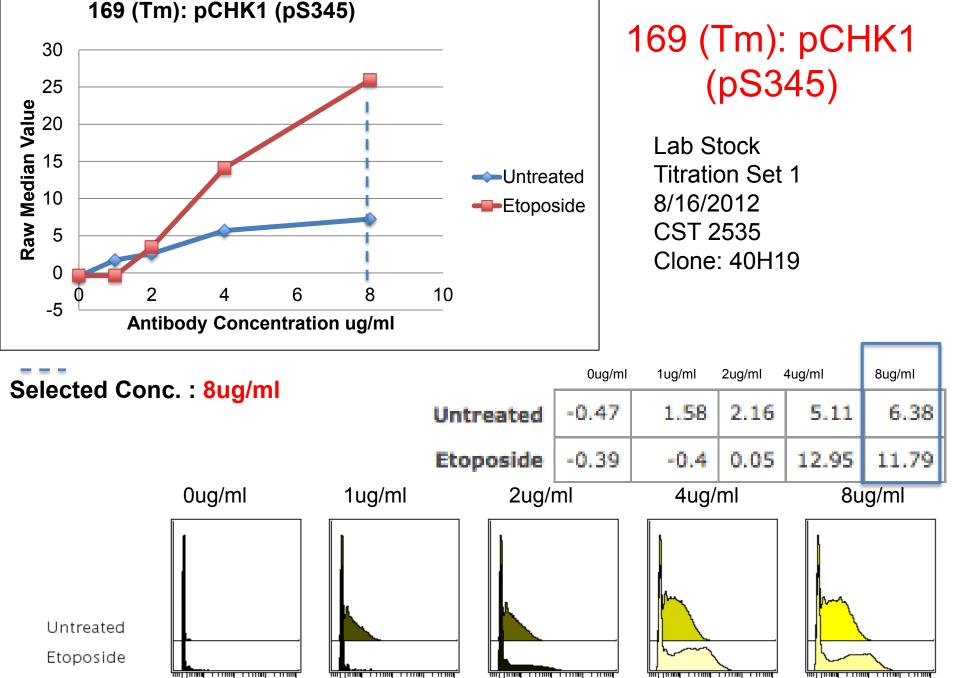
#### Selected Conc. : 4ug/ml











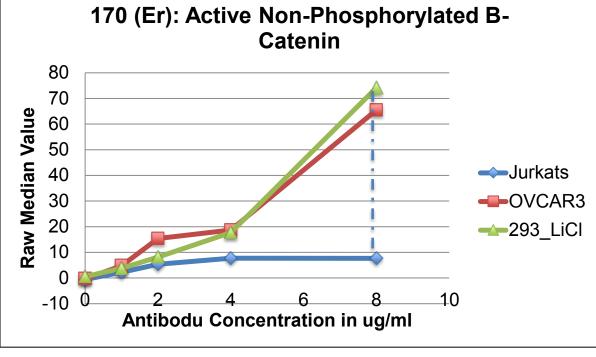
pCHK1

pCHK1

pCHK1

pCHK1

pCHK1



### 170 (Er): Non **Phosphorylated Beta** Catenin

Conjugated: 6/20/2013

**Titration: 6/21/13** 

**CST 8480** 

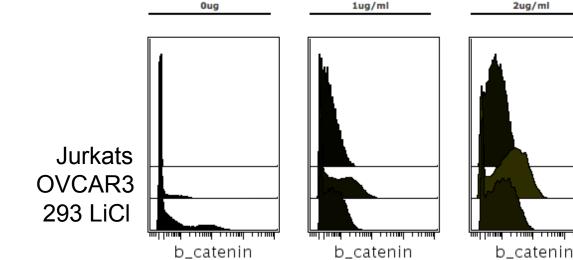
4ug/ml

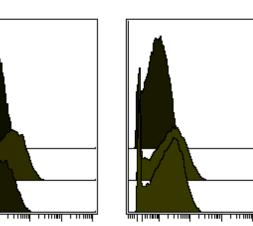
b\_catenin

Clone: D10A8

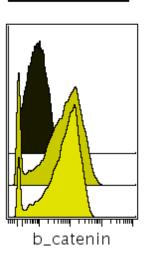
**Jurkats** Selected Conc.: 8ug/ml **OVCAR3 293 LiCI** 

| 0ug   | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|-------|--------|--------|--------|--------|
| -0.54 | 2.25   | 5.36   | 7.7    | 7.68   |
| -0.28 | 4.72   | 15.43  | 18.69  | 65.51  |
| 0.54  | 3.79   | 8.17   | 17.72  | 74.18  |

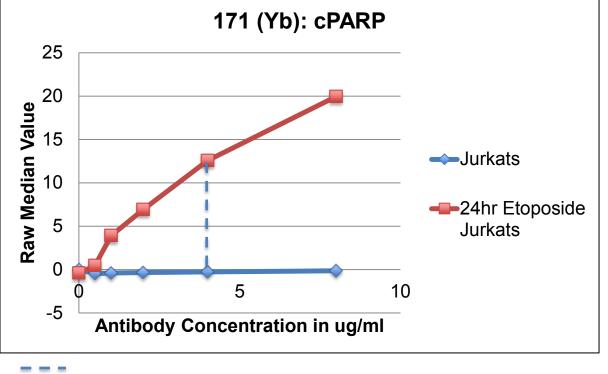




2ug/ml



8ug/ml



#### 171 (Yb): cPARP

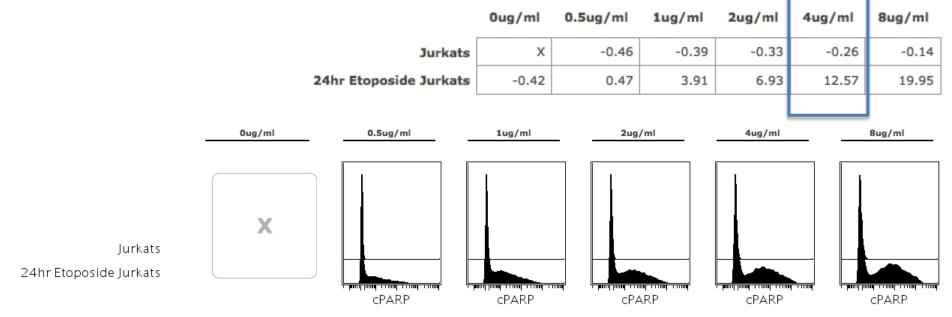
Date Conjugated: 8/21/13

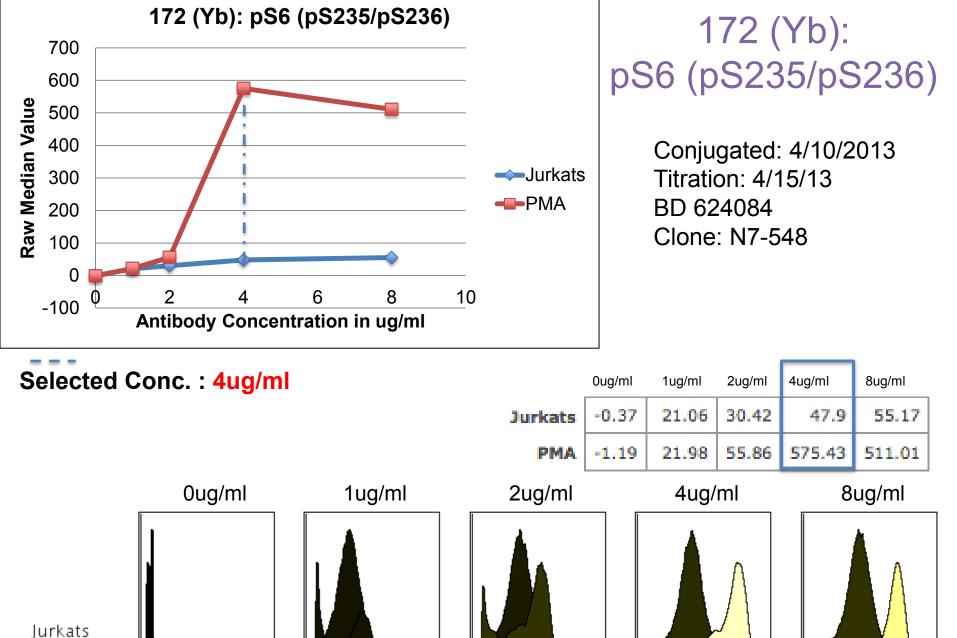
**Titration: 9/10/13** 

BD 624084

Clone: NA







pS6

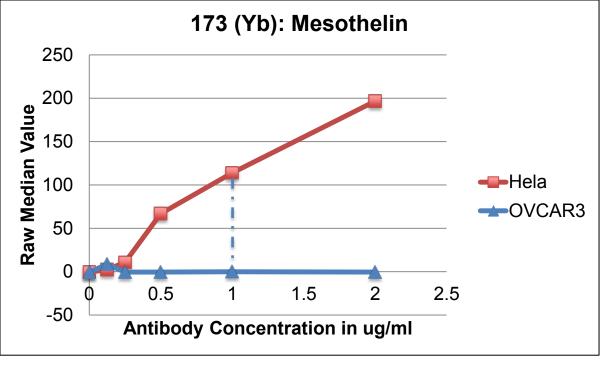
pS6

pS6

PMA

pS6

pS6



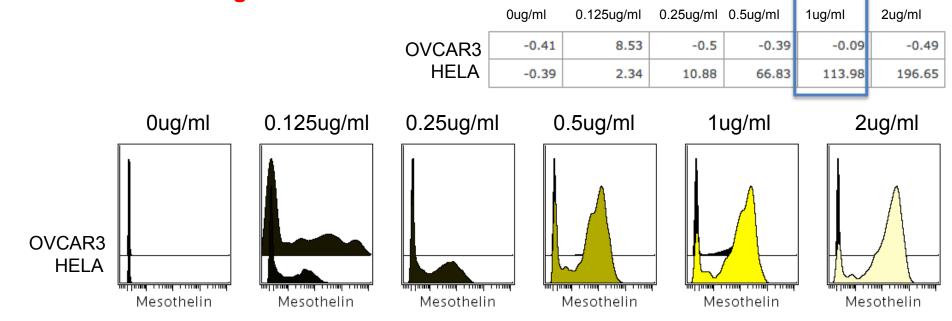
## 173 (Yb): Mesothelin

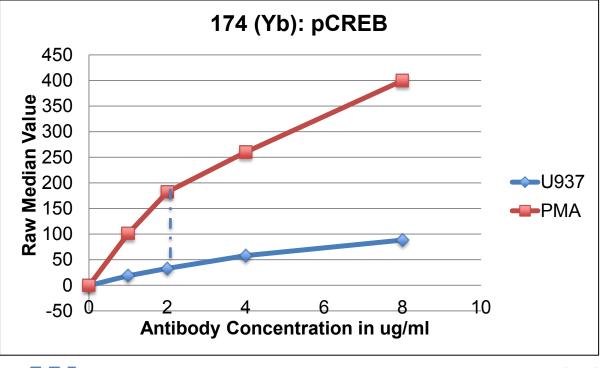
Date Conjugated: Titration: 9/24/13

Rockland 200-301-A87

Clone: MB-G10

Selected Conc. : 1ug/ml





PMA

pCREB

# 174 (Yb): pCREB (S133)

Date Conjugated: 7/22/13

Titration: 8/16/13

CST 9198BF

Clone: 8763

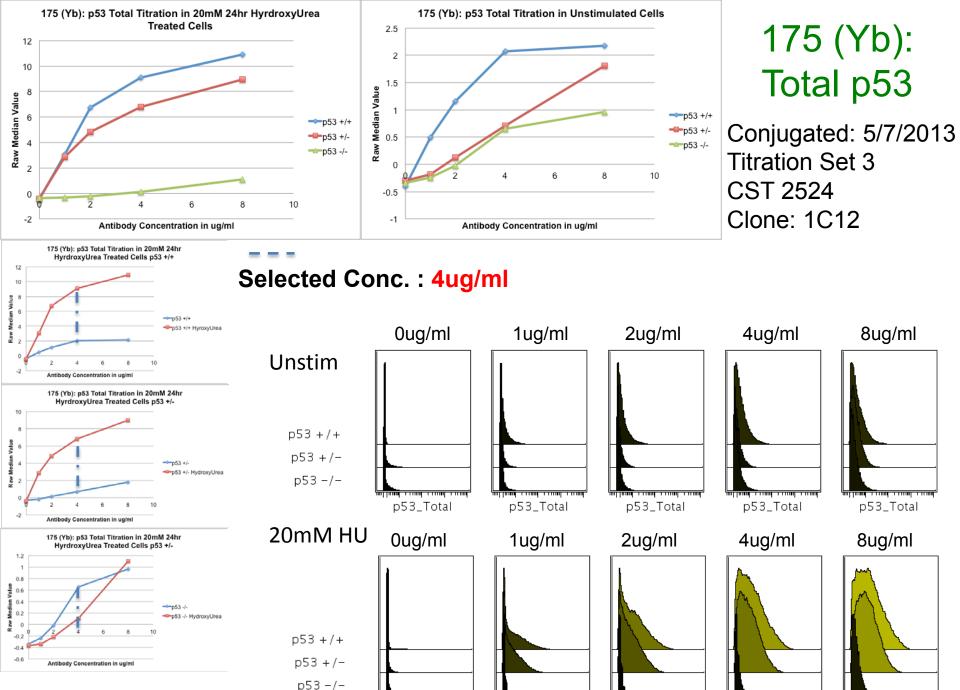
pCREB

pCREB

| Selected C | Conc. : <mark>2ug/ml</mark> |        |      | 0ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|------------|-----------------------------|--------|------|--------|--------|--------|--------|--------|
|            |                             |        | U937 | -0.46  | 18.57  | 33.0   | 58.01  | 88.48  |
|            |                             |        | PMA  | -0.37  | 101.07 | 182.36 | 260.27 | 399.95 |
|            | 0ug/ml                      | 1ug/ml | 2ug/ | ml     | 4ug    | g/ml   | 8u     | ıg/ml  |
| U937       |                             |        |      |        |        |        |        |        |

pCREB

pCREB



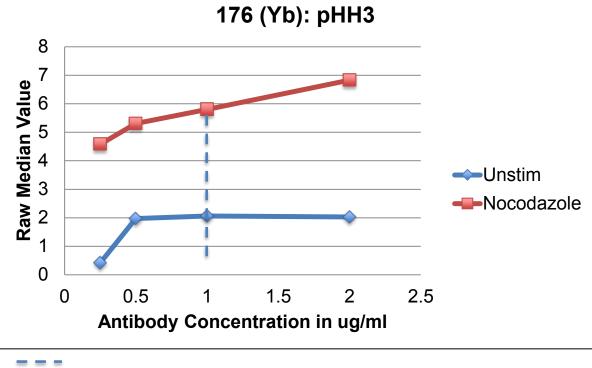
p53\_Total

p53\_Total

p53\_Total

p53\_Total

p53\_Total

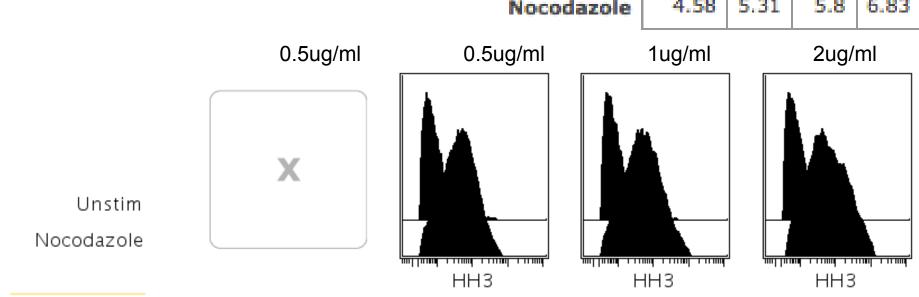


# 176 (Yb): pHH3 (pS28)

Lab Stock Titration Set 1 8/21/2012 Biolegend 641002 Clone: HTA28

0.25ug/ml 0,5ug/ml 1ug/ml 2ug/ml

| Selected Conc. : 1ug/ml | Unstim     | Х    | 1.97 | 2.06 | 2.03 |
|-------------------------|------------|------|------|------|------|
|                         | Nocodazole | 4.58 | 5.31 | 5.8  | 6.83 |



Appendix C —

OVCAR — Immune Panel

Titrations 2012-2013

## OVCAR Immune Panel 1 – Metal assignation

| In113 | CD235/CD61          |
|-------|---------------------|
| In115 | HLA-DR              |
| La139 | CD45                |
| 140Ce | NKG2D               |
| Pr141 | CCR6                |
| Nd142 | pMAPKAPK2 (pT334)   |
| Nd143 | pSTAT1 (pY701)      |
| Nd144 | CD11b               |
| Nd145 | CD4                 |
| Nd146 | CD8                 |
| Sm147 | p-H2AX (pS139)      |
| Nd148 | CD123               |
| Sm149 | p-NFkB (pS529)      |
| Nd150 | CD206               |
| Eu151 | p-ERK (pT202/pY204) |
| Sm152 | Ki67 (total)        |
| Eu153 | CD45RA              |
| Sm154 | pSTAT3              |
| Gd155 | CD19                |
| Gd156 | BDCA2               |
|       |                     |

| Gd157p | CD11c                |
|--------|----------------------|
| Gd158  | CD33                 |
| Tb159  | CCR7                 |
| Gd160  | CD14                 |
| Dy161  | CD66b                |
| Dy162  | pSTAT5               |
| Dy163  | CXCR3                |
| Dy164  | ICOS                 |
| Ho165  | CD16                 |
| Er166  | FoxP3                |
| Er167  | CD163                |
| Er168  | CD68                 |
| Tm169  | CD25                 |
| Er170  | CD3                  |
| Yb171  | cleaved-PARP (@N214) |
| Yb172  | pS6 (pS235/pS236)    |
| Yb173  | LAG-3                |
| Yb174  | CREB                 |
| Lu175  | PD-1                 |
| Yb176  | CD56                 |
|        |                      |

#### CD235 113In

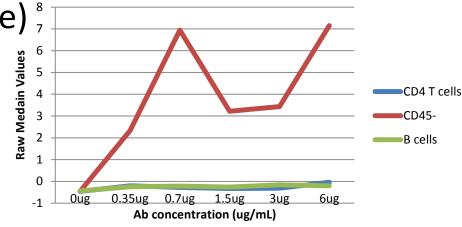
CD235a/b 113In (Surface) 3

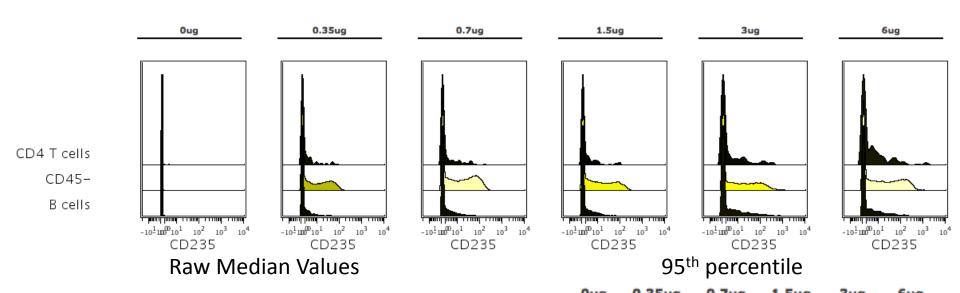
Clone: HIR2 (Biolegend) Conjugation: 2013-01-24

Titration: 2013-03-15

**Human Bone Marrow** 

Staining conc.: 1.5ug/mL





0.7ug 0ug 0.35ug 1.5ug 6ug -0.31CD4 T cells -0.46-0.2-0.28-0.33-0.04CD45--0.452.33 6.94 3.22 3.43 7.15 -0.25-0.22-0.26-0.44-0.16-0.2 B cells

CD4 T cells CD45-B cells

| oug   | 0.35ug | 0.7ug  | 1.5ug  | 3ug    | ьug    |
|-------|--------|--------|--------|--------|--------|
| -0.03 | 25.83  | 35.5   | 28.58  | 136.93 | 121.47 |
| -0.04 | 74.02  | 127.41 | 138.61 | 262.24 | 303.99 |
| -0.04 | 15.11  | 24.7   | 23.73  | 157.69 | 65.52  |

# CD61 113In(Surface)

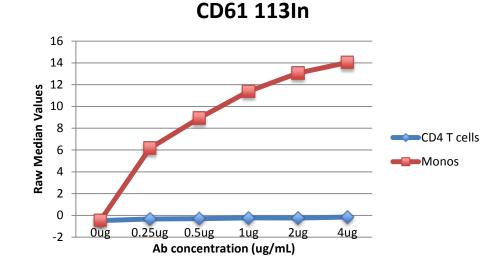
Clone: VI-PL2 (BD)

Conjugation: 2013-01-24

Titration: 2013-04-26

PBMCs - Live/frozen, thawed - rested 3h

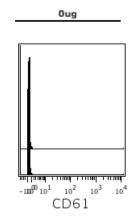
Staining conc.: 1ug/mL

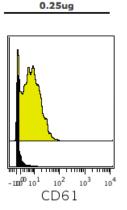


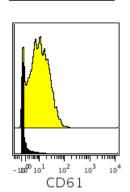


Monos

CD4 T cells

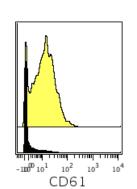


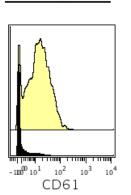


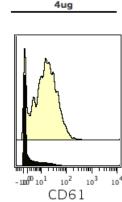


CE

0.5ug







Raw Median Values

| 0ug   | 0.25ug | 0.5ug | 1ug   | 2ug   | 4ug   |
|-------|--------|-------|-------|-------|-------|
| -0.47 | 6.16   | 8.93  | 11.39 | 13.07 | 14.03 |
| -0.48 | -0.33  | -0.31 | -0.23 | -0.24 | -0.16 |

#### 95<sup>th</sup> percentile

|            | 0ug   | 0.25ug | 0.5ug | 1ug   | 2ug   | 4ug   |
|------------|-------|--------|-------|-------|-------|-------|
| Monos      | -0.02 | 28.81  | 40.49 | 53.47 | 65.56 | 70.37 |
| D4 T cells | -0.03 | 5.98   | 9.0   | 19.32 | 20.81 | 28.01 |

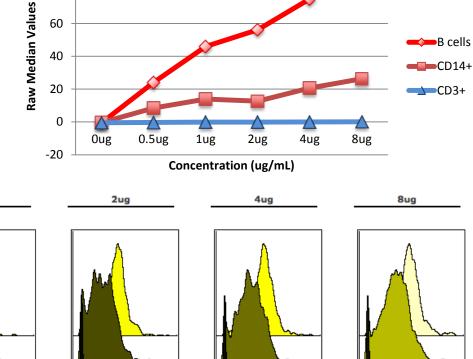
# HLA-DR 115In (Surface)

Clone: L243 (Biolegend) Conjugation: 2013-08-19

Titration: 2013-09-05

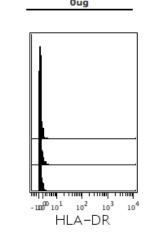
PBMCs – Live/frozen, thawed - rested 3h

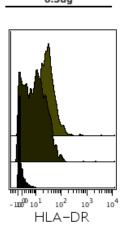
Staining conc.: 2ug/mL

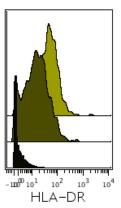


HLA-DR 115In

#### B cells CD14+ CD3+







1ug



80

60

95<sup>th</sup> percentile

|         | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|---------|-------|-------|-------|-------|-------|-------|
| B cells | -0.46 | 24.04 | 45.98 | 56.14 | 74.96 | 93.54 |
| CD14+   | -0.43 | 8.49  | 13.93 | 12.65 | 20.66 | 26.27 |
| CD3+    | -0.45 | -0.32 | -0.08 | -0.08 | -0.02 | 0.05  |

Raw Median Values

|         | 0ug  | 0.5ug | 1ug   | 2ug    | 4ug    | 8ug    |
|---------|------|-------|-------|--------|--------|--------|
| B cells | 0.8  | 84.92 | 181.0 | 287.59 | 366.37 | 581.56 |
| CD14+   | 0.89 | 44.6  | 88.77 | 90.22  | 127.82 | 212.01 |
| CD3+    | 0.73 | 5.01  | 13.39 | 12.19  | 15.95  | 24.97  |

 $-100^{00} 10^{1}$   $10^{2}$   $10^{3}$ 

HLA-DR

 $-100^{00} \, 10^{1} \quad 10^{2} \quad 10^{3}$ 

HLA-DR

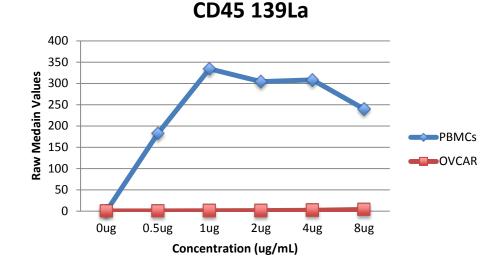
# CD45 139La (Surface)

Clone: HI30 (Biolegend) Conjugation: 2013-08-19

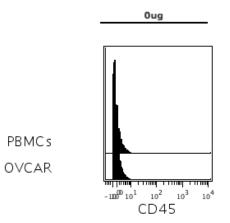
Titration: 2013-09-05

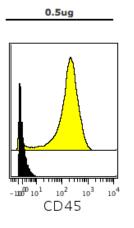
PBMCs – Live/frozen, thawed - rested 3h

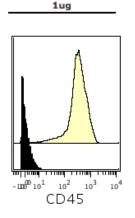
OVCARs – Fixed/Frozen



Staining conc.: 1ug/mL

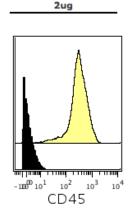


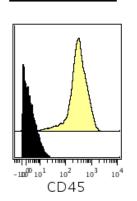




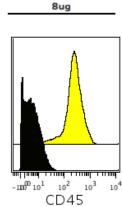
**PBMCs** 

OVCAR





4ug



Raw Median Values

|       | 0ug  | 0.5ug  | 1ug    | 2ug    | 4ug    | 8ug    |
|-------|------|--------|--------|--------|--------|--------|
| PBMCs | 0.1  | 182.69 | 334.14 | 304.13 | 308.33 | 239.82 |
| OVCAR | 0.27 | 0.33   | 0.68   | 1.07   | 2.06   | 3.91   |

#### 95<sup>th</sup> percentile

| 0ug  | 0.5ug  | 1ug    | 2ug    | 4ug    | 8ug    |
|------|--------|--------|--------|--------|--------|
| 4.33 | 562.88 | 971.35 | 906.75 | 944.79 | 707.91 |
| 4.11 | 4.22   | 5.71   | 7.01   | 10.95  | 17.41  |

#### NKG2D 140Ce

# NKG2D 140Ce (Surface)

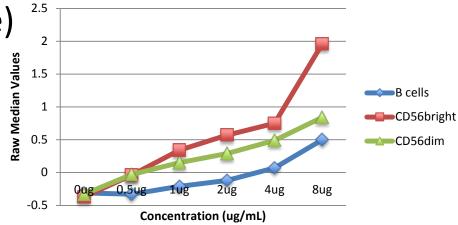
Clone: ()

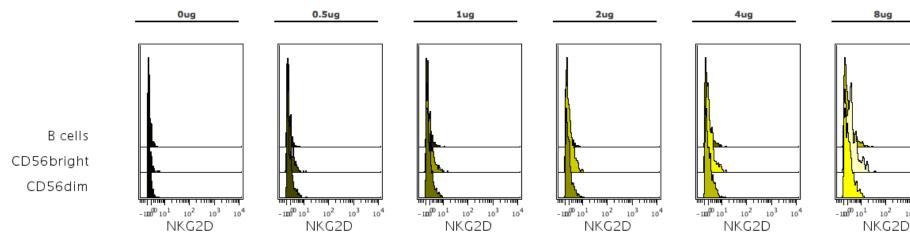
Conjugation: 2013-08-19

Titration:

PBMCs - Live/frozen, thawed - rested 3h

Staining conc.: 8ug/mL





Raw Median Values

|            | Oug   | 0.5ug | 1ug   | 2ug   | 4ug  | 8ug  |
|------------|-------|-------|-------|-------|------|------|
| B cells    | -0.31 | -0.33 | -0.21 | -0.12 | 0.07 | 0.5  |
| CD56bright | -0.37 | -0.04 | 0.34  | 0.57  | 0.75 | 1.96 |
| CD56dim    | -0.33 | -0.03 | 0.15  | 0.29  | 0.49 | 0.84 |

95<sup>th</sup> percentile

|            | 0ug  | 0.5ug | 1ug  | 2ug  | 4ug  | 8ug   |
|------------|------|-------|------|------|------|-------|
| B cells    | 1.65 | 1.83  | 3.15 | 2.86 | 5.27 | 9.24  |
| CD56bright | 1.86 | 3.72  | 5.51 | 5.03 | 7.04 | 12.33 |
| CD56dim    | 1.46 | 4.34  | 4.38 | 4.35 | 5.19 | 6.81  |

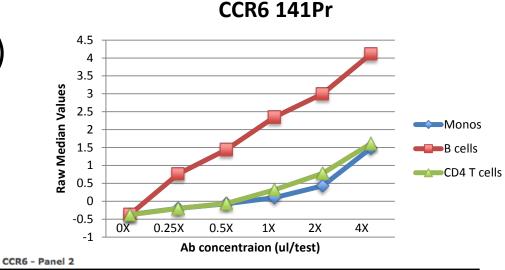
# CCR6 141Pr (Surface)

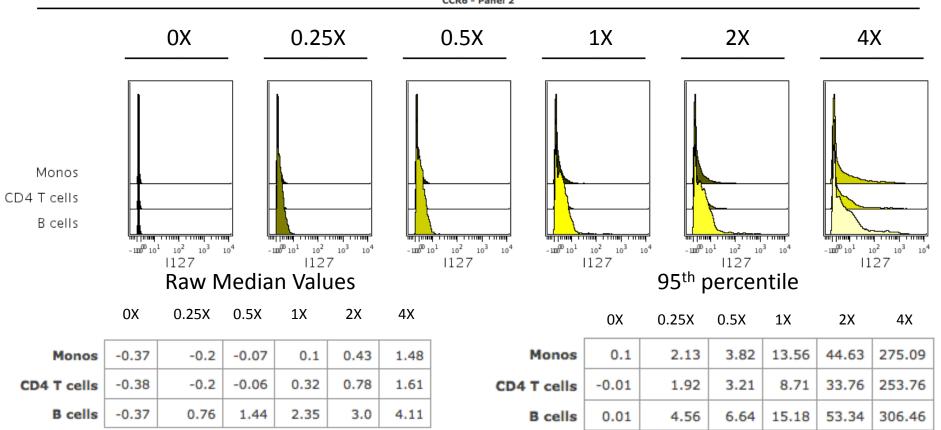
Clone: G034E3 (DVS)

Conjugation: DVS

Titration: 2013-08-27

PBMCs - Live/frozen, thawed - rested 3h



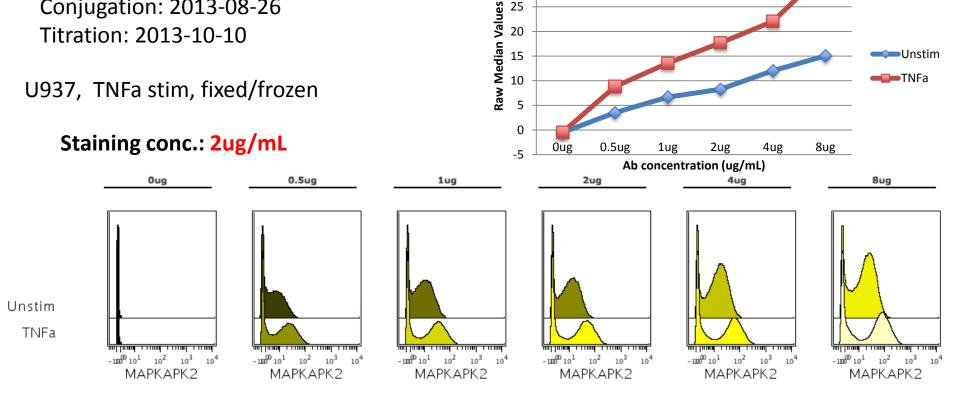


# pMAPKAPK2 142Nd (ICS)

pMAPKAPK2 142Nd

Clone: 27B7 pT334 (CST) Conjugation: 2013-08-26

Titration: 2013-10-10



Unstim

TNFa

35

30

25

20

#### Raw Median Values

|        | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|--------|-------|-------|-------|-------|-------|-------|
| Instim | -0.51 | 3.52  | 6.68  | 8.26  | 12.04 | 15.06 |
| TNFa   | -0.45 | 8.82  | 13.57 | 17.69 | 22.04 | 32.3  |

#### 95<sup>th</sup> percentile

| 0ug   | 0.5ug | 1ug   | 2ug    | 4ug    | 8ug    |
|-------|-------|-------|--------|--------|--------|
| -0.01 | 23.52 | 31.79 | 36.18  | 47.98  | 61.01  |
| 0.92  | 60.92 | 88.98 | 120.47 | 155.63 | 201.58 |

### pSTAT1 143Nd (ICS)

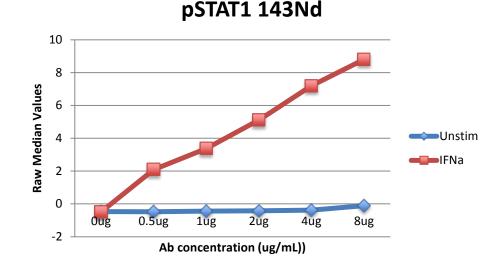
Clone: 4a pY701 (BD)

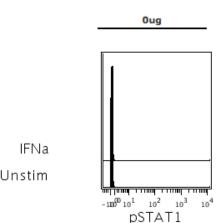
Conjugation: 2013-08-21

Titration: 2013-10-10

Splenocytes, IFNa stimulated, fixed/frozen

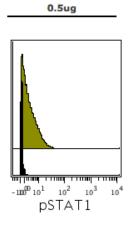
Staining conc.: 4ug/mL

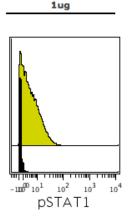


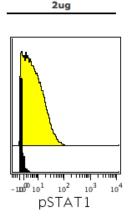


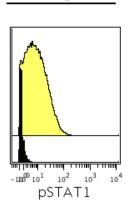
**IFNa** 

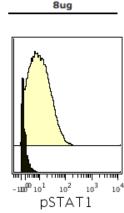
Unstim











Raw Median Values

| 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|-------|-------|-------|-------|-------|-------|
| -0.49 | 2.09  | 3.37  | 5.11  | 7.19  | 8.8   |
| -0.47 | -0.48 | -0.44 | -0.42 | -0.38 | -0.11 |

|        | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug  | 8ug   |
|--------|-------|-------|-------|-------|------|-------|
| IFNa   | -0.04 | 14.07 | 22.16 | 30.38 | 42.5 | 48.32 |
| Unstim | -0.03 | 0.55  | 0.87  | 1.38  | 2.11 | 3.32  |

### CD11b 144Nd (Surface)

Clone: IRCF44 (DVS)

Conjugation: DVS

-0.32

-0.33

CD14+

CD4+

12.91

-0.01

13.82

0.32

25.0

0.68

27.96

0.91

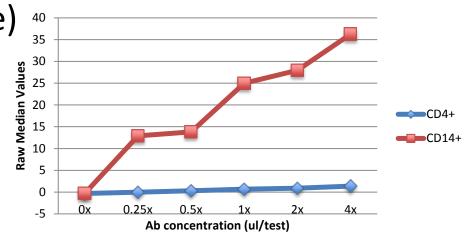
36.26

1.36

Titration: 2012-08-16

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 1ul/test



44.63

11.57

48.71

12.23

78.77

15.02

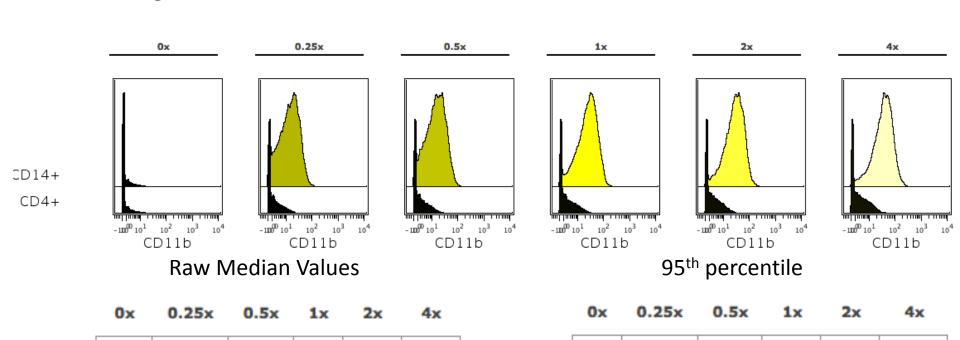
84.97

14.36

111.03

17.69

CD11b 144Nd



CD14+

CD4+

7.0

6.71

#### CD4 145Nd (Surface)

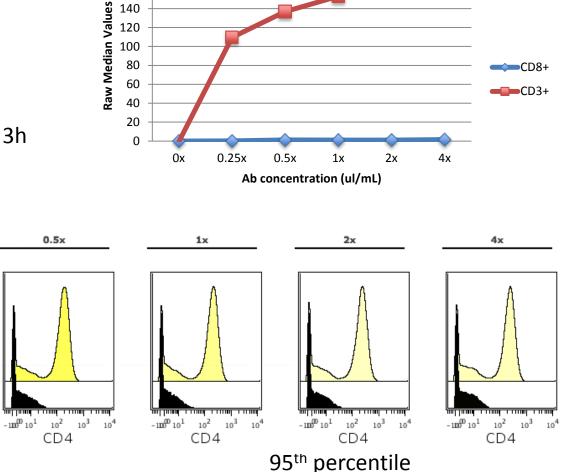
Clone: RPA-T4 (DVS)

Conjugation: DVS

Titration: 2012-08-16

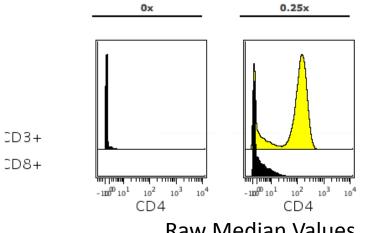
PBMCs – Live/frozen, thawed - rested 3h

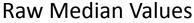
Staining conc.: 0.5ul/test



CD4 145Nd

180 160





|      | 0x    | 0.25x | 0.5x   | 1x     | 2x     | 4x     |      |
|------|-------|-------|--------|--------|--------|--------|------|
| CD3+ | -0.44 | 109.7 | 136.83 | 153.05 | 168.63 | 167.41 | CD3- |
| CD8+ | Х     | 0.18  | 1.15   | 0.96   | 1.1    | 1.53   | CD8- |

| 0x   | 0.25x  | 0.5x   | 1x     | 2x     | 4x     |
|------|--------|--------|--------|--------|--------|
| 1.95 | 262.06 | 324.45 | 364.92 | 415.74 | 413.56 |
| x    | 13.33  | 17.86  | 15.35  | 17.21  | 18.57  |

#### CD8 146Nd (Surface)

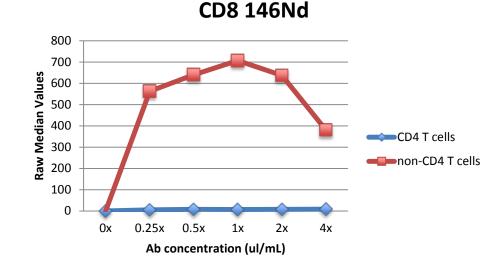
Clone: RPA-T8 (DVS)

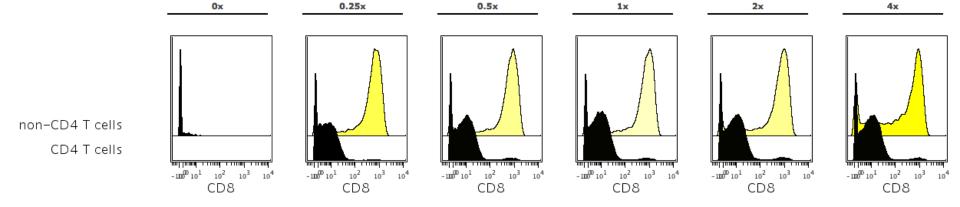
Conjugation: DVS

Titration: 2012-08-16

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 0.5ul/test





#### Raw Median Values

#### 0x0.25x 0.5x2x4x non-CD4 T cells -0.43562.52 639.59 706.93 636.96 380.24 CD4 T cells Х 5.17 7.31 7.15 7.68 8.01

|                | VX   | U.23X   | U.3X   | **      | 2.4    | 44      |
|----------------|------|---------|--------|---------|--------|---------|
| on-CD4 T cells | 5.08 | 1387.04 | 1567.0 | 1709.86 | 1640.7 | 1373.62 |
| CD4 T cells    | Х    | 30.43   | 53.65  | 47.39   | 119.97 | 66.44   |

### pH2AX 147Sm (ICS)

Clone: JBW301 pS139 (Millipore)

Conjugation: 2013-02-13

Titration: 2013-02-14

Jurkat – Etoposide treated

-0.49

Etoposide

504.49

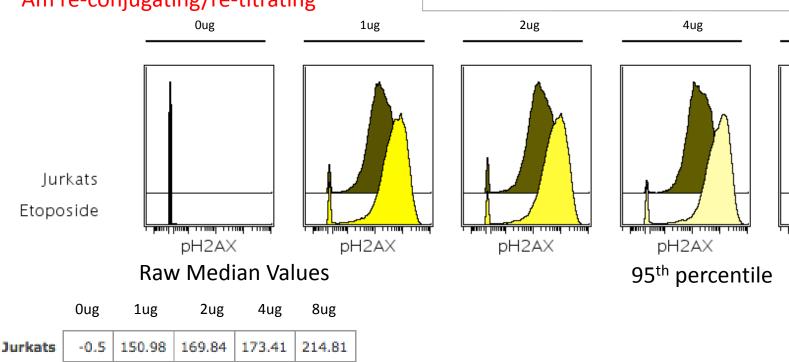
605.9

836.7

887.14

Staining conc.: 4ug/mL

Am re-conjugating/re-titrating



1000

800

600

400

200

-200

2

Raw Median Value

147(Sm): pH2AX(pS139) Titration in Etoposide
Teated Jurkats

Antibody Concentration in ug/ml

→Jurkats

10

8ug

pH2AX

**Etoposide** 

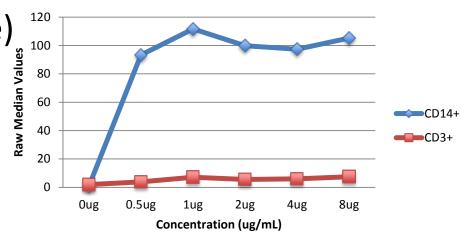
### CD123 148Nd (Surface)

Clone: 6H6 (Biolegend) Conjugation: 2013-08-26

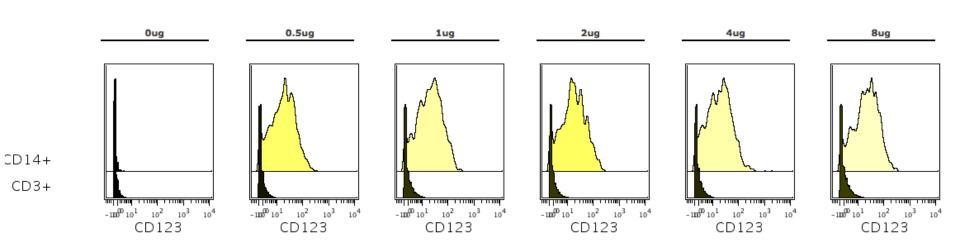
Titration: 2013-08-27

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 1ug/mL



CD123 148Nd



Raw Median Values

|       | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|-------|-------|-------|-------|-------|-------|-------|
| CD14+ | -0.45 | 17.91 | 19.95 | 16.46 | 17.78 | 21.88 |
| CD3+  | -0.34 | -0.28 | -0.16 | -0.14 | -0.11 | -0.06 |

|      | oug  | 0 |
|------|------|---|
| 314± | 0.88 | 9 |

CD3+

| oug  | o.sug | Lug    | Lug   | Tug   | oug    |
|------|-------|--------|-------|-------|--------|
| 0.88 | 93.34 | 111.71 | 99.78 | 97.39 | 105.25 |
| 1.89 | 3.87  | 7.14   | 5.53  | 5.93  | 7.48   |

Rug

### pNFkB 149Sm (ICS)

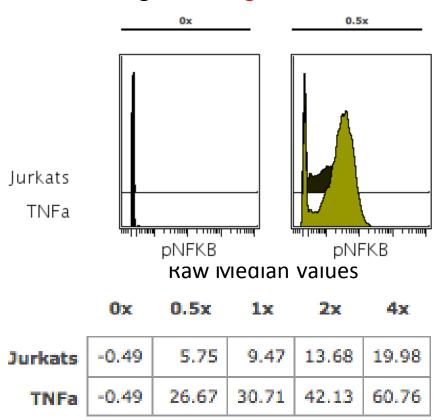
Clone: K10-895.12.50 pS529 (BD)

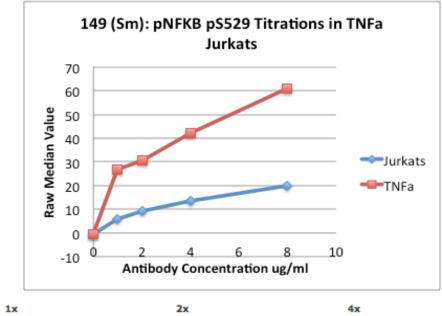
Conjugation: 2012-09-19

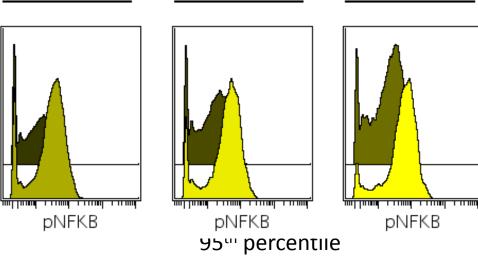
Titration: 2012-09-28

Jurkat - TNFa stim

Staining conc.: 4ug/mL







#### CD206 150Nd

#### CD206 150Nd (Surface) 40 (Surface) 40 (Surface) 40 (Surface) 40 (Surface) 40 (Surface)

Clone: 19.2 (BD)

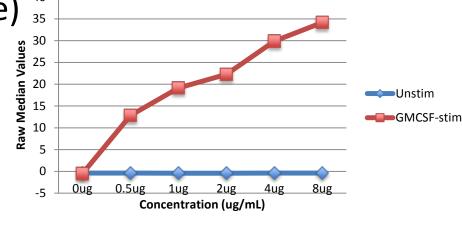
Conjugation: 2013-08-26

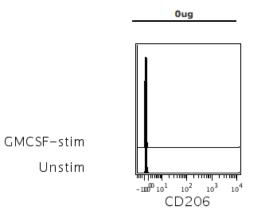
Titration: 2013-09-09

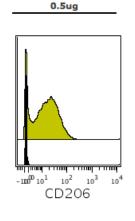
PBMCs - Unstim: Fixed/frozen

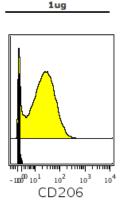
Stim: GMCS 10ng/mL 3 days

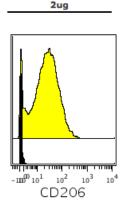
Staining conc.: 2 ug/mL

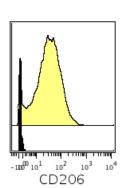




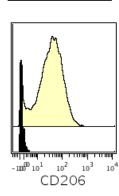








4ug



8ug

Raw Median Values

|            | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|------------|-------|-------|-------|-------|-------|-------|
| GMCSF-stim | -0.51 | 12.84 | 19.15 | 22.26 | 29.89 | 34.17 |
| Unstim     | -0.38 | -0.39 | -0.43 | -0.43 | -0.39 | -0.4  |

|            | Oug   | 0.5ug | 1ug   | 2ug    | 4ug    | 8ug    |
|------------|-------|-------|-------|--------|--------|--------|
| GMCSF-stim | -0.04 | 72.36 | 99.09 | 116.86 | 151.65 | 162.92 |
| Unstim     | -0.03 | 0.0   | 0.29  | 0.43   | 0.71   | 1.51   |

#### pERK 151Eu (ICS)

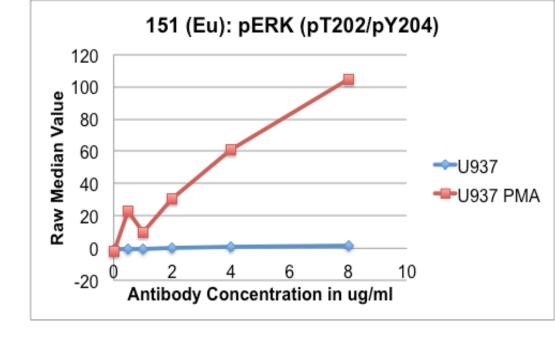
Clone: 20A pT202/Y204 (BD)

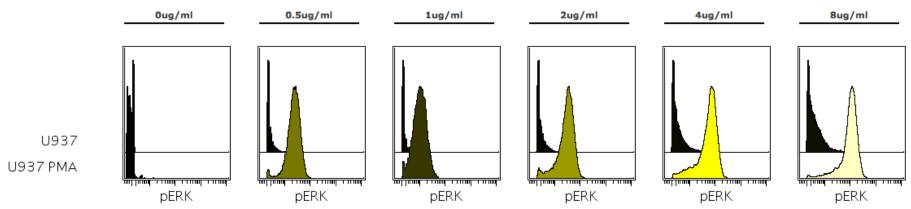
Conjugation: 2013-02-12

Titration: 2013-10-01

U937 - PMA Stim

Staining conc.: 2 ug/mL





Raw Median Values

95<sup>th</sup> percentile

|          | Oug/ml | 0.5ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|----------|--------|----------|--------|--------|--------|--------|
| U937     | -0.43  | -0.2     | -0.38  | -0.08  | 0.69   | 1.63   |
| U937 PMA | -2.0   | 23.27    | 9.57   | 30.69  | 61.14  | 104.86 |

### Ki67 152Sm (ICS)

Clone: B56 totalKi67 (BD) Conjugation: 2013-03-15

Titration: 2013-03-21

HTC116 – Nocodazole treated

Staining conc.: 2ug/mL

-0.37

-0.49

**HCT116** 

Nocodazole

67.89

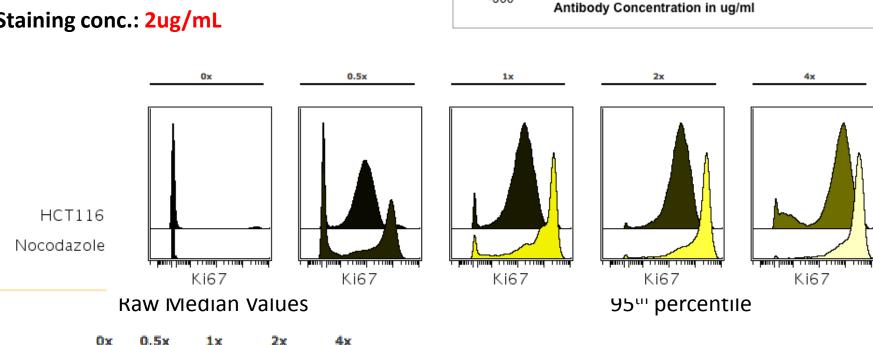
194.5

151.33

1235.78

256.66

2001.93



571.46

2611.07

152 (Sm):

3000

2500

2000

1500

1000

500

-500

Raw Median Values

Ki67 Titration in Nocodazole Treated

HCT116

10

Nocodazole

**HCT116 Cells** 

#### CD45RA 153Eu (Surface)

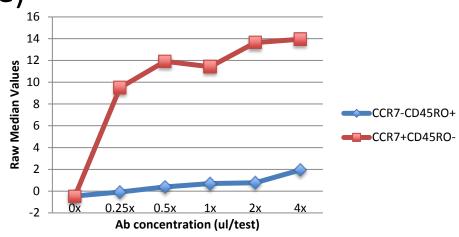
Clone: HI100 (DVS) Conjugation: DVS

Titration: 2012-10-24

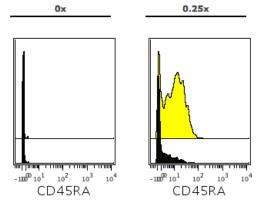
PBMCs - Live/frozen, thawed - rested 3h

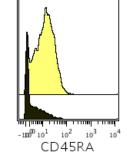
Staining conc.: 0.5ul/test



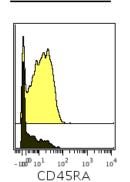


CD8 T cells
CCR7+CD45R0CCR7-CD45R0+

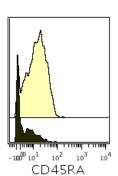




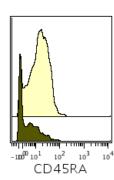
0.5x



1x



2x



4x

Raw Median Values

95<sup>th</sup> percentile

|              | 0x    | 0.25x | 0.5x  | 1x    | 2x    | 4x    |
|--------------|-------|-------|-------|-------|-------|-------|
| CCR7+CD45RO- | -0.48 | 9.49  | 11.92 | 11.42 | 13.63 | 13.94 |
| CCR7-CD45RO+ | -0.45 | -0.08 | 0.39  | 0.69  | 0.77  | 1.95  |

| CCR7+CD45RO- |  |
|--------------|--|
| CCR7-CD45RO+ |  |

| UX    | 0.25X | U.5X  | 1X    | 2X    | 4X    |
|-------|-------|-------|-------|-------|-------|
| -0.01 | 38.44 | 46.48 | 46.09 | 50.65 | 49.16 |
| 0.46  | 19.77 | 23.0  | 26.08 | 23.1  | 33.77 |

### pSTAT3 154Sm (ICS)

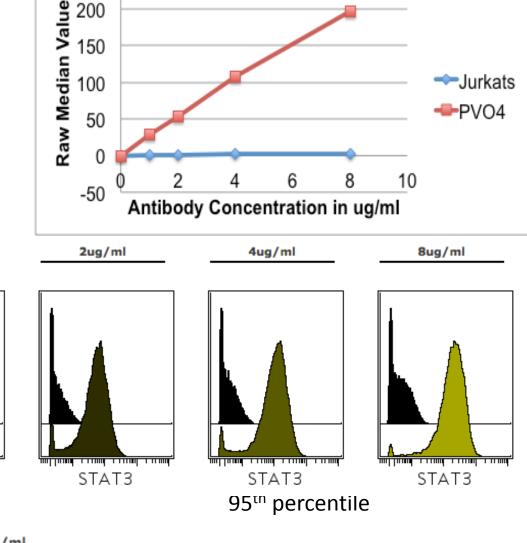
Clone: 4P STAT-3 pY705 (BD)

Conjugation: 2013-07-16

Titration: 2013-08-16

Jurkat – PVO4 Stim

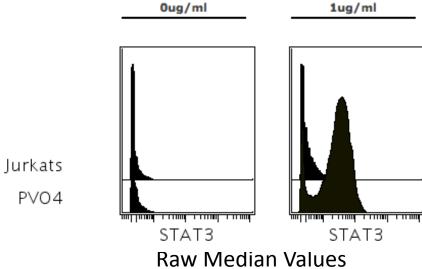
Staining conc.: 6ug/mL



154 (Sm): STAT3

250

200



|         | oug/mi | Tug/mi | ∠ug/mi | 4ug/mi | oug/mi |
|---------|--------|--------|--------|--------|--------|
| Jurkats | -0.35  | 0.36   | 0.93   | 1.69   | 2.48   |
| PVO4    | -0.33  | 28.87  | 53.75  | 107.17 | 195.9  |

#### CD19 155Gd (Surface)

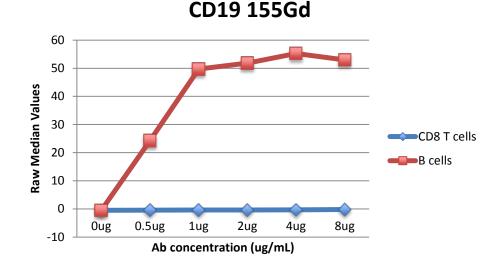
Clone: HIB19 (BD)

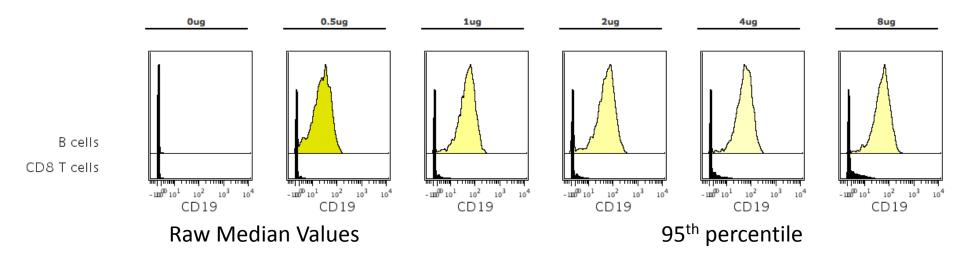
Conjugation: 2012-10-26

Titration: 2012-11-01

Staining conc.: 1ug/mL

PBMCs – Live/frozen, thawed - rested 3h





|             | oug   | 0.5ug | rug   | zug   | 4ug   | oug   |
|-------------|-------|-------|-------|-------|-------|-------|
| B cells     | -0.47 | 24.25 | 49.74 | 51.83 | 55.22 | 52.93 |
| CD8 T cells | -0.48 | -0.46 | -0.41 | -0.39 | -0.33 | -0.24 |

|             | Oug   | 0.5ug | 1ug    | 2ug    | 4ug    | 8ug    |  |
|-------------|-------|-------|--------|--------|--------|--------|--|
| B cells     | -0.01 | 74.62 | 132.74 | 153.48 | 147.37 | 143.84 |  |
| CD8 T cells | -0.01 | 1.68  | 4.24   | 5.18   | 8.27   | 13.33  |  |

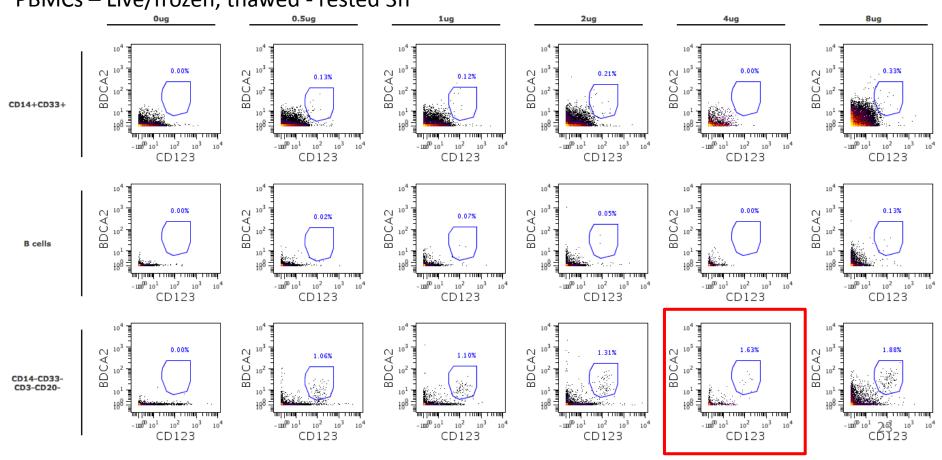
### BDCA2 (CD303) 156Gd (Surface)

Clone: 201A (Biolegend) Conjugation: 2013-05-17

Titration: 2013-05-22

Staining conc.: 4ug/mL

PBMCs – Live/frozen, thawed - rested 3h



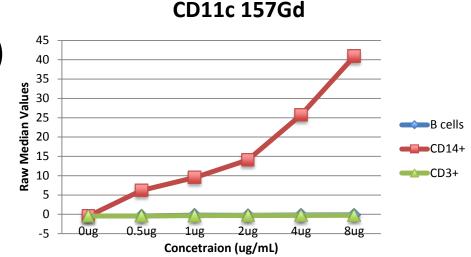
#### CD11c 157Gd (Surface)

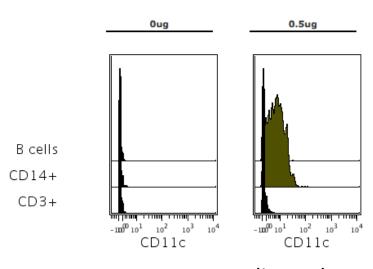
Clone: 3.9 (Biolegend)
Conjugation: 2013-08-19

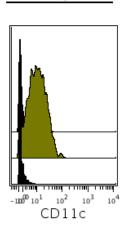
Titration: 2013-08-27

Staining conc.: 4ug/mL

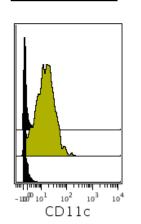
PBMCs – Live/frozen, thawed - rested 3h



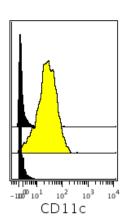




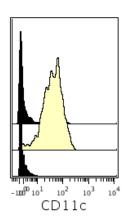
1ug



2ug



4ug



8ug

#### Raw Median Values

|         | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|---------|-------|-------|-------|-------|-------|-------|
| B cells | -0.44 | -0.42 | -0.2  | -0.27 | -0.17 | -0.14 |
| CD14+   | -0.46 | 6.2   | 9.52  | 14.07 | 25.74 | 40.89 |
| CD3+    | -0.44 | -0.43 | -0.33 | -0.29 | -0.28 | -0.27 |

|         | 0ug  | 0.5ug | 1ug   | 1ug 2ug |       | 8ug    |
|---------|------|-------|-------|---------|-------|--------|
| B cells | 0.7  | 5.03  | 14.03 | 9.37    | 21.32 | 55.95  |
| CD14+   | 0.85 | 21.73 | 38.02 | 51.97   | 90.24 | 141.72 |
| CD3+    | 0.83 | 1.91  | 3.78  | 3.27    | 3.74  | 4.67   |

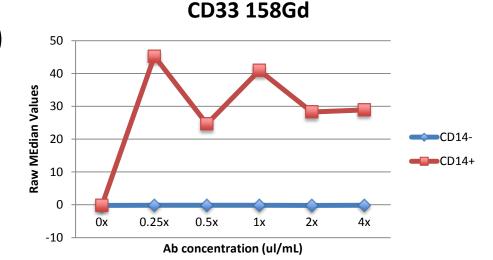
#### CD33 158Gd (Surface)

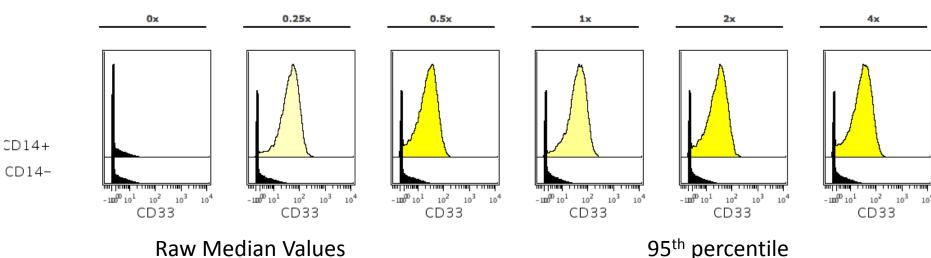
Clone: WM53 (DVS) Conjugation: DVS

Titration: 2012-08-16

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 0.5ul/test





Raw Median Values

|       | 0x    | 0.25x | 0.5x  | 1x    | 2x    | 4x    |
|-------|-------|-------|-------|-------|-------|-------|
| CD14+ | -0.22 | 45.3  | 24.59 | 40.95 | 28.28 | 28.91 |
| CD14- | -0.22 | -0.17 | -0.17 | -0.15 | -0.18 | -0.16 |

|       | 0x    | 0.25x  | 0.5x  | 1x     | 2x    | 4x    |  |
|-------|-------|--------|-------|--------|-------|-------|--|
| CD14+ | 10.98 | 124.94 | 74.69 | 115.08 | 84.66 | 89.22 |  |
| CD14- | 10.85 | 14 28  | 13 44 | 12 18  | 12 17 | 12 12 |  |

#### CCR7 159Tb (Surface)

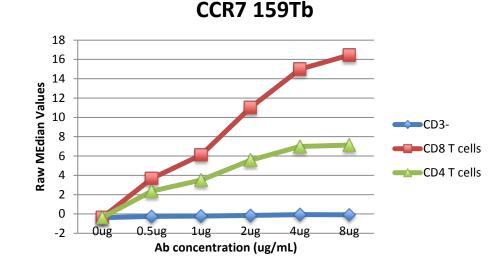
Clone: 150503 (R&D systems)

Conjugation: 2013-08-26

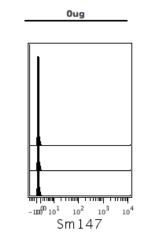
Titration: 2013-08-27

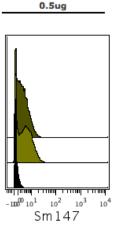
PBMCs – Live/frozen, thawed - rested 3h

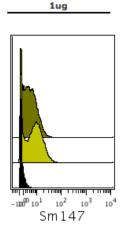
Staining conc.: 3ug/mL





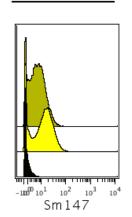




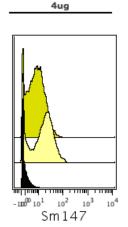


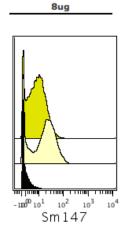
CD4 T

CD8 T



2ug





#### Raw Median Values

|             | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|-------------|-------|-------|-------|-------|-------|-------|
| CD4 T cells | -0.37 | 2.36  | 3.5   | 5.57  | 6.99  | 7.13  |
| CD8 T cells | -0.37 | 3.67  | 6.11  | 11.02 | 14.98 | 16.44 |
| CD3-        | -0.38 | -0.25 | -0.22 | -0.15 | -0.07 | -0.08 |

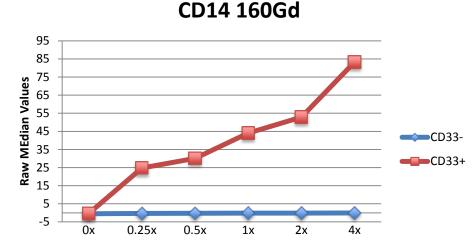
|       | 0ug  | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug  |
|-------|------|-------|-------|-------|-------|------|
| cells | 0.06 | 10.69 | 15.0  | 23.06 | 27.77 | 29.3 |
| cells | 0.1  | 15.58 | 24.79 | 42.95 | 57.7  | 67.7 |
| CD3-  | 0.02 | 1.7   | 2.27  | 3.45  | 5.17  | 6.38 |

### CD14 160Gd (Surface)

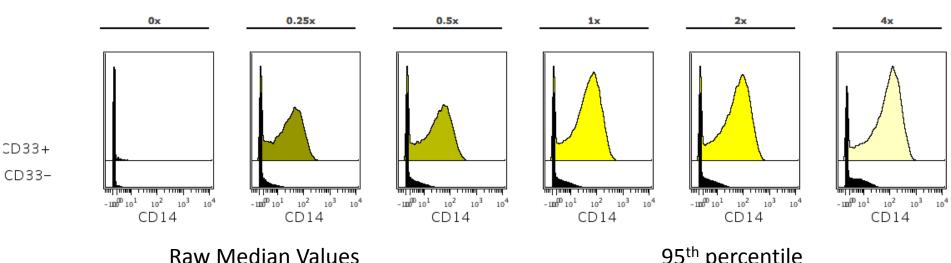
Clone: M5E2 (DVS) Conjugation: DVS

Titration: 2012-08-16

PBMCs – Live/frozen, thawed - rested 3h



Ab concentration (ul/test) Staining conc.: 1.5ul/test (epitope is MeOH sensitive)



95<sup>th</sup> percentile

|       | 0x    | 0.25x | 0.5x  | 1x    | 2x    | 4x    |       | 0x   | 0.25x  | 0.5x   | 1x     | 2x     | 4x     |
|-------|-------|-------|-------|-------|-------|-------|-------|------|--------|--------|--------|--------|--------|
| CD33+ | -0.44 | 24.81 | 30.04 | 44.07 | 52.84 | 83.25 | CD33+ | 2.8  | 125.86 | 153.39 | 198.72 | 248.99 | 356.03 |
| CD33- | -0.46 | -0.28 | -0.2  | -0.17 | -0.12 | -0.04 | CD33- | 1.27 | 7.94   | 12.01  | 12.73  | 14.73  | 18.63  |

## CD66b 161Dy (Surface)

Clone: G10F5 (Biolegend) Conjugation: 2013-05-01

Titration: 2013-05-10

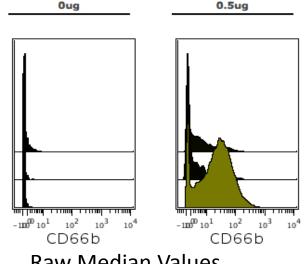
CD45hi

B cells

CD45low

Whole Blood – Smart tube buffer treated

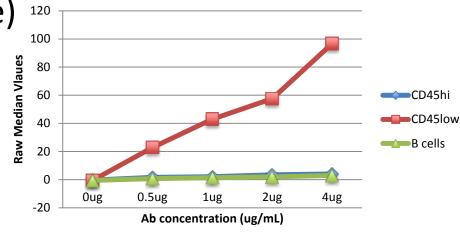
Staining conc.: 2ug/mL



Raw Median Values

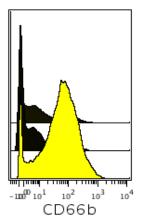
|         | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug  |
|---------|-------|-------|-------|-------|------|
| CD45hi  | -0.35 | 1.58  | 2.13  | 3.41  | 4.03 |
| B cells | -0.52 | 0.73  | 1.45  | 1.96  | 2.95 |
| CD45low | -0.49 | 22.89 | 43.03 | 57.55 | 96.7 |

#### CD66b 161Dy

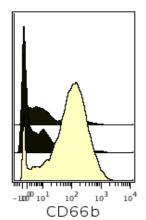


| -m <sup>00</sup> 10 <sup>1</sup> 10 <sup>2</sup> 10 <sup>3</sup> 10 <sup>4</sup>         |
|--|
| -100 <sup>00</sup> 10 <sup>1</sup> 10 <sup>2</sup> 10 <sup>3</sup> 10 <sup>4</sup> CD66b |

1ug



2ug



4ug

95<sup>th</sup> percentile

|         | oug  | 0.5ug  | 1ug    | 2ug    | 4ug    |
|---------|------|--------|--------|--------|--------|
| CD45hi  | 3.12 | 60.81  | 107.54 | 177.77 | 263.03 |
| B cells | 0.23 | 55.96  | 88.15  | 156.87 | 257.43 |
| D45low  | 0.58 | 135.19 | 260.08 | 362.57 | 585.28 |

### pSTAT5 162Dy (ICS)

Clone: 47 pY694 (BD)

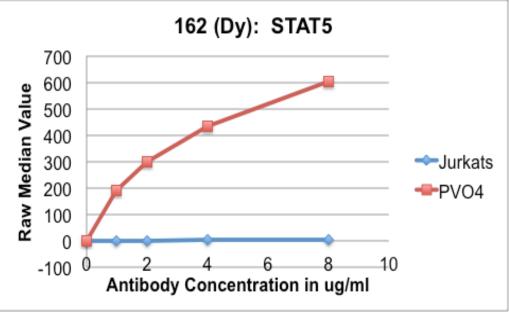
Conjugation: 2013-07-16

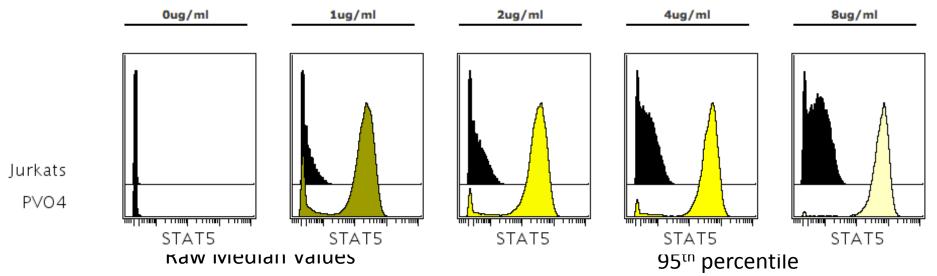
Titration: 2013-08-16

Jurkat - PVO4 Stim

Oua /ml

Staining conc.: 4ug/mL





Qua/ml

Aug /ml

|         | oug/ IIII | rug/ IIII | zug/iiii | Tug/IIII | oug/ IIII |
|---------|-----------|-----------|----------|----------|-----------|
| Jurkats | -0.58     | 0.54      | 1.58     | 3.06     | 4.87      |
| PVO4    | -0.59     | 188.56    | 299.01   | 432.66   | 602.37    |

2ua/ml

1ua/ml

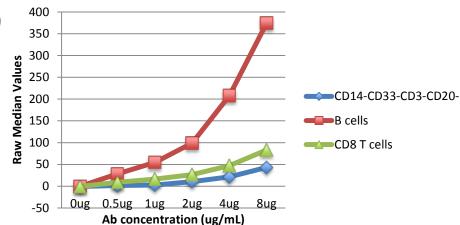
# CXCR3 163Dy (Surface) 400 T

Clone: G025H7 (Biolegend) Conjugation: 2013-05-17

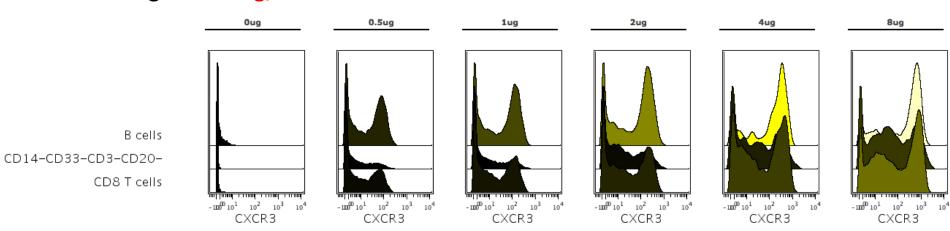
Titration: 2013-05-22

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 2ug/mL



**CXCR3 163Dy** 



#### Raw Median Values

95<sup>th</sup> percentile

|                     | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug    | 8ug    |
|---------------------|-------|-------|-------|-------|--------|--------|
| B cells             | -0.19 | 28.28 | 54.34 | 98.77 | 207.78 | 374.18 |
| CD14-CD33-CD3-CD20- | -0.46 | 1.43  | 2.86  | 10.34 | 21.58  | 42.93  |
| CD8 T cells         | -0.44 | 9.06  | 16.15 | 26.47 | 47.26  | 83.24  |
|                     |       |       |       |       |        |        |

| 0ug   | 0.5ug  | 1ug                        | 2ug                                      | 4ug   | 8ug  |
|-------|--------|----------------------------|--|---|--|
| 5.54  | 150.94 | 263.58                     | 427.43                                   | 650.17  | 1096.53  |
| -0.01 | 95.42  | 187.91                     | 360.0                                    | 647.73  | 1195.7   |
| 0.92  | 113.99 | 216.52                     | 388.68                                   | 664.2   | 1191.4   |
|       | 5.54   | 5.54 150.94<br>-0.01 95.42 | 5.54 150.94 263.58<br>-0.01 95.42 187.91 | 5.54 150.94 263.58 427.43<br>-0.01 95.42 187.91 360.0 | Oug         0.5ug         1ug         2ug         4ug           5.54         150.94         263.58         427.43         650.17           -0.01         95.42         187.91         360.0         647.73           0.92         113.99         216.52         388.68         664.2 |

### ICOS 164Dy (Surface)

Clone: C398.4A (Biolegend) Conjugation: 2013-08-19

Titration: 2013-09-05

PBMCs – Live/frozen, thawed

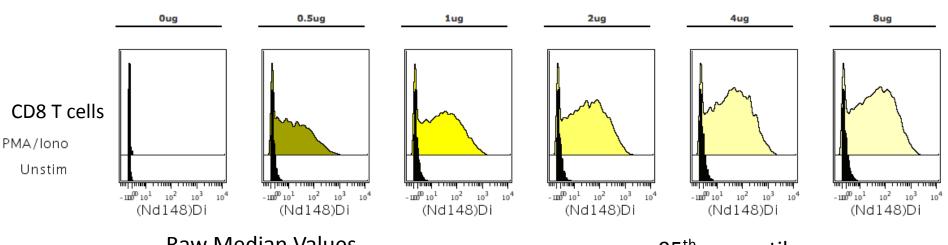
24h stim PMA/Iono

Staining conc.: 2ug/mL



Ab concentration (ug/mL)

ICOS - Panel 1



#### Raw Median Values

|          | oug   | 0.5ug | rug   | zug   | 4ug   | oug   |
|----------|-------|-------|-------|-------|-------|-------|
| PMA/Iono | -0.48 | 11.25 | 22.78 | 29.68 | 34.25 | 36.05 |
| Unstim   | -0.41 | -0.18 | -0.07 | -0.04 | 0.05  | 0.0   |

|          | 0ug   | 0.5ug  | 1ug    | 2ug    | 4ug    | 8ug   |
|----------|-------|--------|--------|--------|--------|-------|
| PMA/Iono | 0.13  | 199.77 | 355.04 | 418.24 | 464.28 | 480.5 |
| Unstim   | -0.01 | 2.12   | 2.71   | 2.7    | 2.99   | 3.4   |

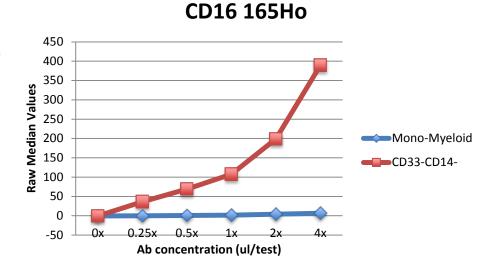
#### CD16 165Ho (Surface)

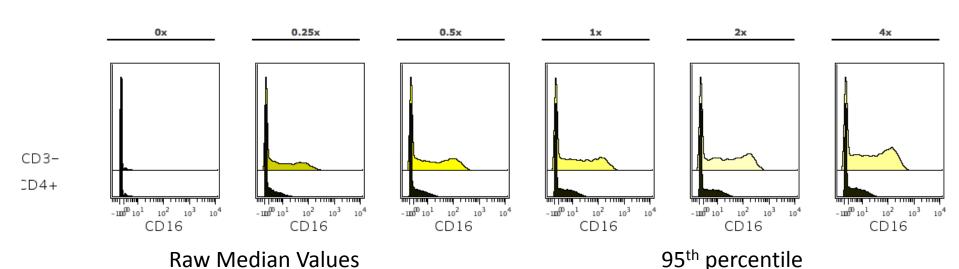
Clone: 3G8 (DVS) Conjugation: DVS

Titration: 2012-08-16

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 1ul/test





|      | UX    | 0.25X | 0.5x  | 1X    | 2x    | 4X    |
|------|-------|-------|-------|-------|-------|-------|
| CD3- | -0.45 | 2.11  | 5.2   | 6.96  | 10.12 | 13.25 |
| CD4+ | -0.44 | -0.23 | -0.18 | -0.11 | -0.1  | -0.05 |

|      | 0x   | 0.25x  | 0.5x   | 1x     | 2x    | 4x     |  |
|------|------|--------|--------|--------|-------|--------|--|
| CD3- | 2.07 | 107.81 | 181.14 | 215.65 | 261.9 | 239.98 |  |
| D4+  | 2.29 | 10.33  | 12.94  | 16.4   | 19.29 | 17.42  |  |

### FoxP3 166Er (ICS)

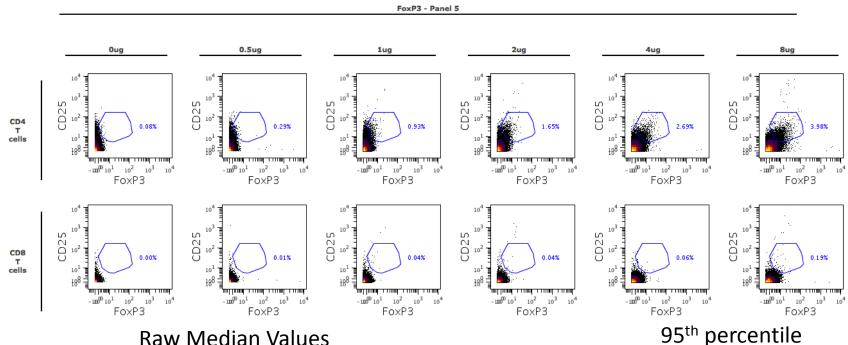
Clone: PCH101 (Ebioscience)

Conjugation: 2013-08-26

Titration: 2013-08-27

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 8ug/mL



Raw Median Values

|             | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug  | 8ug  |
|-------------|-------|-------|-------|-------|------|------|
| CD4 T cells | -0.25 | -0.2  | -0.02 | 0.19  | 0.7  | 1.22 |
| CD8 T cells | -0.36 | -0.33 | -0.24 | -0.12 | 0.34 | 0.85 |

|             | Oug  | 0.5ug | lug  | 2ug  | 4ug  | 8ug  |
|-------------|------|-------|------|------|------|------|
| CD4 T cells | 1.68 | 1.95  | 2.76 | 3.34 | 4.93 | 7.31 |
| CD8 T cells | 0.99 | 1.36  | 2.0  | 2.27 | 3.45 | 4.77 |

### CD163 167Er (Surface)

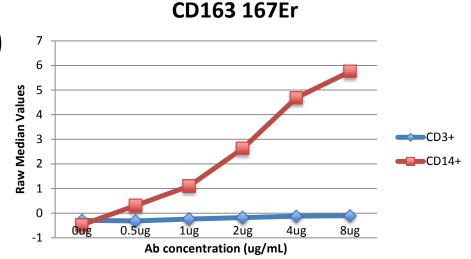
Clone: GHI/61 (BD)

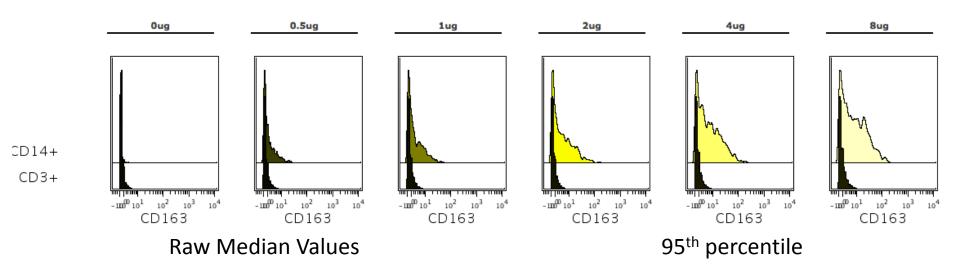
Conjugation: 2013-08-26

Titration: 2013-09-05

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 6 ug/mL





|       | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug  |
|-------|-------|-------|-------|-------|-------|------|
| CD14+ | -0.47 | 0.31  | 1.1   | 2.63  | 4.69  | 5.75 |
| CD3+  | -0.29 | -0.32 | -0.24 | -0.18 | -0.12 | -0.1 |

|       | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug   |
|-------|-------|-------|-------|-------|-------|-------|
| CD14+ | -0.01 | 10.57 | 16.71 | 33.18 | 49.23 | 57.05 |
| CD3+  | 1.97  | 2.61  | 3.13  | 2.97  | 3.68  | 4.23  |

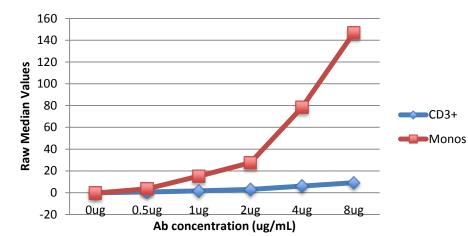
### CD68 168Er (ICS)

Clone: Y1/82A (Biolegend) Conjugation: 2013-08-26

Titration: 2013-08-27

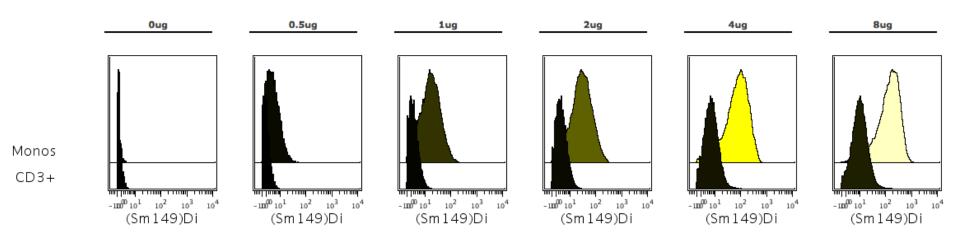
PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 6 ug/mL



CD68 168Er

CD68 - Panel 5



#### Raw Median Values

|       | 0ug   | 0.5ug | 1ug   | 2ug   | 4ug   | 8ug    |
|-------|-------|-------|-------|-------|-------|--------|
| Monos | -0.41 | 3.53  | 15.19 | 27.46 | 78.45 | 146.82 |
| CD3+  | -0.12 | 0.62  | 1.67  | 2.97  | 6.11  | 9.2    |

|       | Oug  | 0.5ug | 1ug   | 2ug    | 4ug    | 8ug    |
|-------|------|-------|-------|--------|--------|--------|
| Monos | 1.29 | 14.65 | 63.97 | 117.47 | 285.24 | 463.01 |
| CD3+  | 2.06 | 4.03  | 7.14  | 10.44  | 20.53  | 31.53  |

#### CD25 169Tm (Surface)

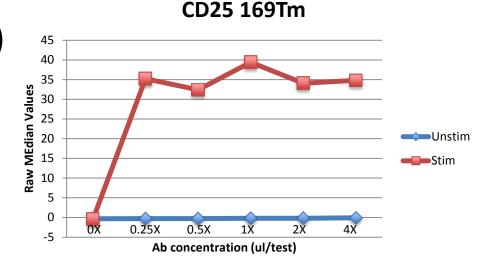
Clone: 2A3 (DVS) Conjugation: DVS

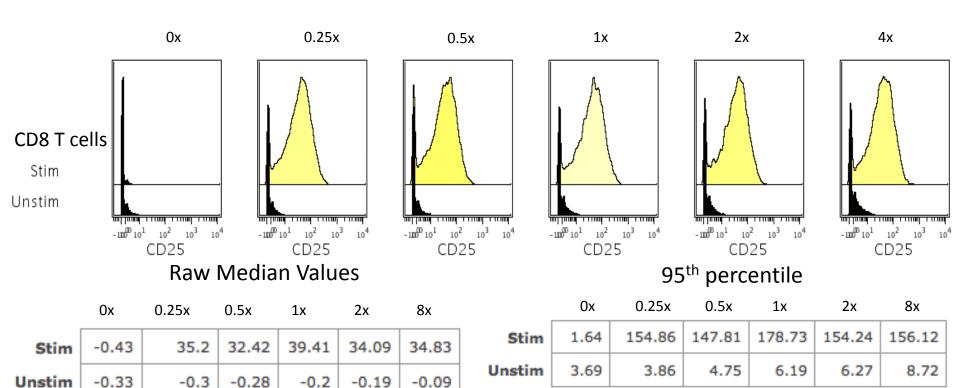
Titration: 2012-12-12

PBMCs – Live/frozen, thawed

24h stim PMA/Iono

Staining conc.: 1ul/test





#### CD3 170Er (Surface)

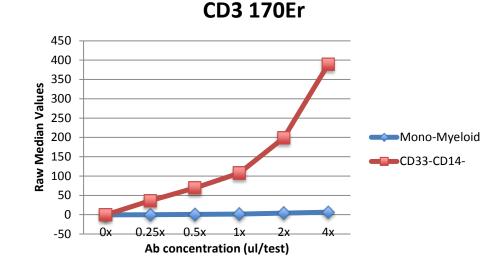
Clone: UCHT1 (DVS)

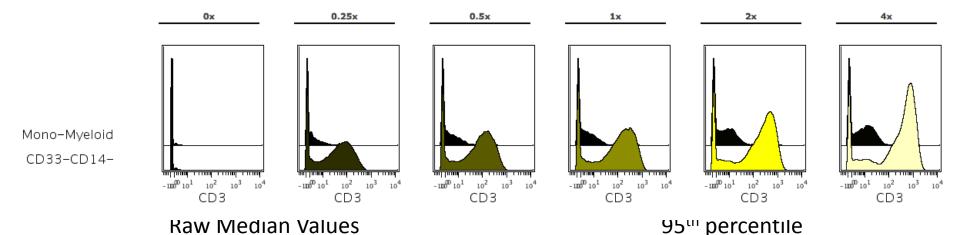
Conjugation: DVS

Titration: 2012-08-16

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 0.5ul/test





0.25x0.5x1x Mono-Myeloid -0.093.85 -0.450.89 1.51 6.43 CD33-CD14-389.8 -0.4536.35 68.91 107.47 199.1

|              | 0x   | 0.25x  | 0.5x   | 1x     | 2x     | 4x      |
|--------------|------|--------|--------|--------|--------|---------|
| Mono-Myeloid | 1.91 | 29.73  | 117.66 | 172.81 | 364.06 | 436.12  |
| CD33-CD14-   | 1.83 | 257.99 | 423.1  | 676.11 | 988.06 | 1430.68 |

### cPARP 171Yb (ICS)

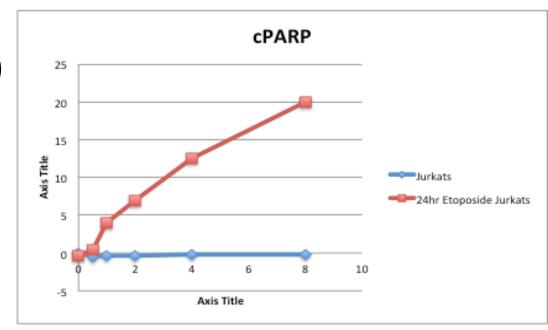
Clone: F21- 852 (BD)

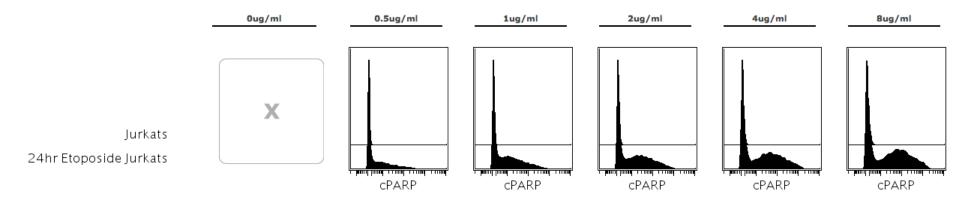
Conjugation: 2013-08-21

Titration: 2013-9-10

Jurkat, – 24h Etoposide

Staining conc.: 4ug/mL





#### Raw Median Values

95<sup>th</sup> percentile

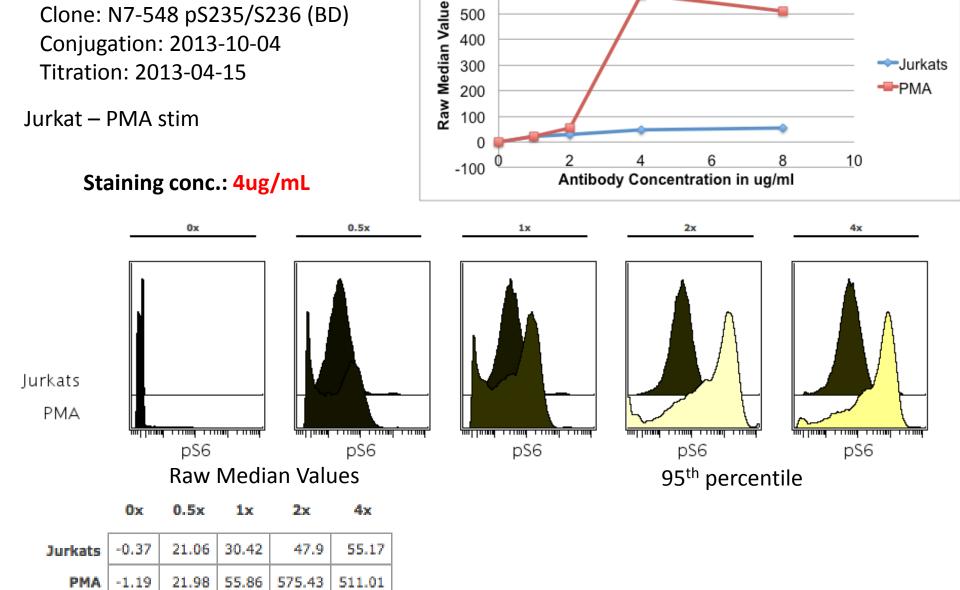
|                        | 0ug/ml | 0.5ug/ml | 1ug/ml | 2ug/ml | 4ug/ml | 8ug/ml |
|------------------------|--------|----------|--------|--------|--------|--------|
| Jurkats                | х      | -0.46    | -0.39  | -0.33  | -0.26  | -0.14  |
| 24hr Etoposide Jurkats | -0.42  | 0.47     | 3.91   | 6.93   | 12.57  | 19.95  |

### pS6 172Yb (ICS)

Clone: N7-548 pS235/S236 (BD)

Conjugation: 2013-10-04

Titration: 2013-04-15



700 600

500 400

300

172 (Yb): pS6 (pS235/pS236) Titration in PMA Stimulated Jurkats

Jurkats

### LAG-3 173Yb (Surface)

Clone: N/A (R&D systems) Conjugation: 2013-08-19

Titration: 2013-09-05

PBMCs – Live/frozen, thawed

- 24h stim PMA/Iono

-0.48

-0.45

PMA/Iono

Unstim

-0.14

-0.37

0.38

-0.3

1.5

-0.22

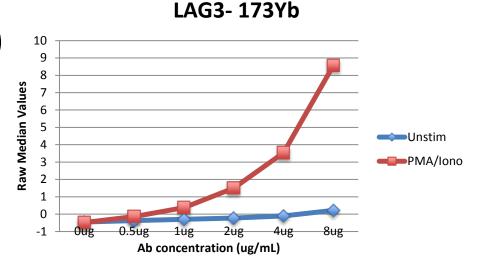
3.54

-0.1

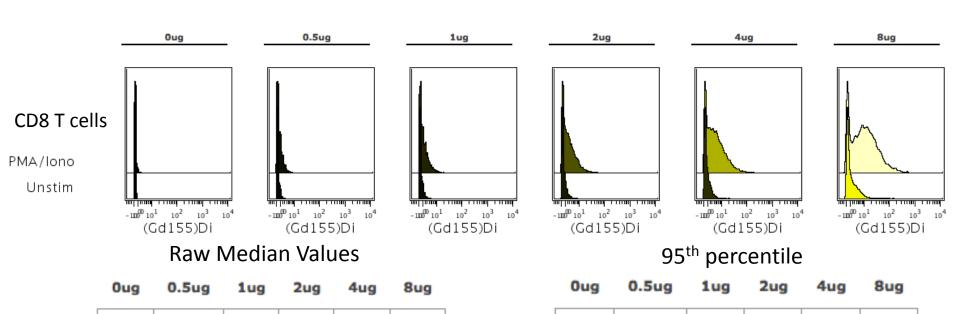
8.57

0.22

Staining conc.: 6ug/mL



LAG3 - Panel 1



PMA/Iono

Unstim

0.69

-0.04

3.18

0.99

6.31

2.24

13.14

4.35

29.22

7.91

83.73

40.87

### pCREB 174Yb (ICS)

Clone: 87G3 pS133 (CST) Conjugation: 2013-7-22

Titration: 2013-8-16

U937 - PMA stim

U937

**PMA** 

-0.46

-0.37

18.57

101.07

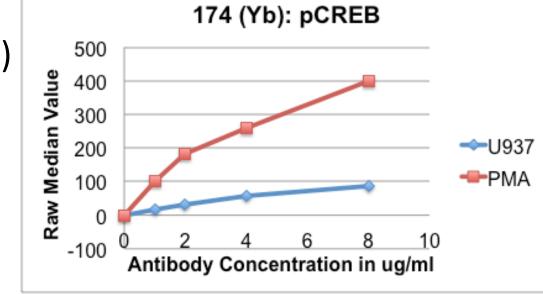
33.0

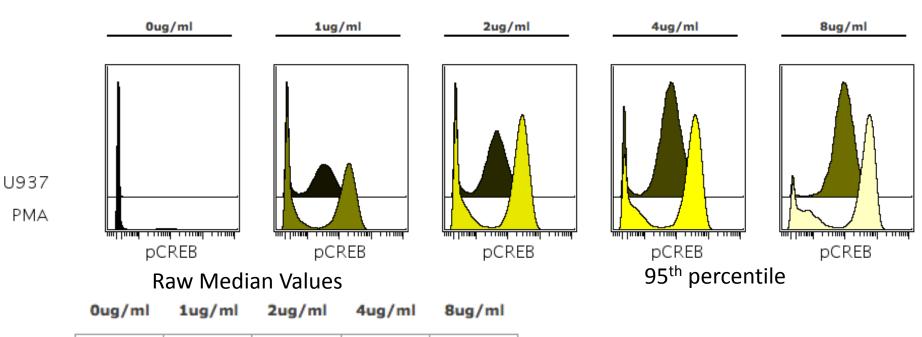
182.36

58.01

260.27

Staining conc.: 2ug/mL





88.48

399.95

#### PD-1 175Lu (Surface)

Clone: EH12.2H7 (DVS)

Conjugation: DVS

Titration: 2013-09-05

PBMCs - Live/frozen, thawed

- 24h stim PMA/Iono

PMA/Iono

Unstim

Staining conc.: 2ul/test

-0.18

-0.42

-0.48

-0.45

0.02

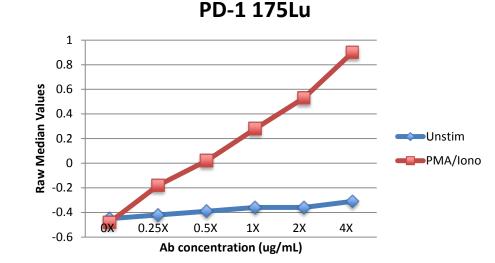
-0.39

0.28

-0.36

0.53

-0.36



11.8

0.61

14.57

1.08

15.53

1.24

16.77

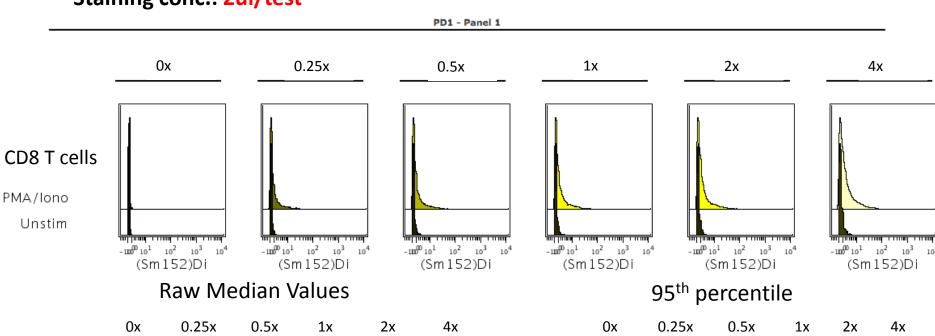
1.57

18.89

2.19

-0.02

-0.04



0.9

-0.31

PMA/Iono

Unstim

#### CD56 176Yb (Surface)

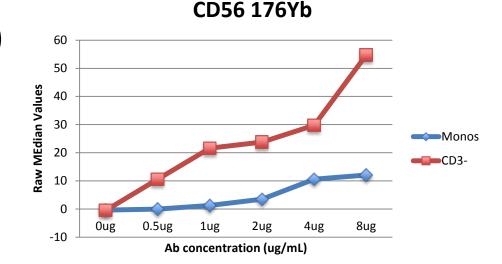
Clone: NCAM16.2 (BD) Conjugation: 2013-01-24

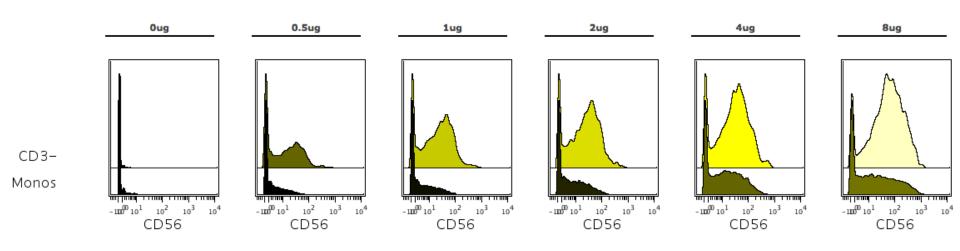
Titration: 2013-01-26

Out

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 1ug/mL





Rua

#### Raw Median Values

|       | oug   | oloug | Lug   | Lug   | rug   | oug   |
|-------|-------|-------|-------|-------|-------|-------|
| CD3-  | -0.47 | 10.58 | 21.65 | 23.81 | 29.75 | 54.71 |
| Monos | -0.39 | -0.02 | 1.28  | 3.49  | 10.61 | 12.08 |

0.500

# CD3-

|      | •      | - 1    |       |        |        |  |
|------|--------|--------|-------|--------|--------|--|
| 0ug  | 0.5ug  | 1ug    | 2ug   | 4ug    | 8ug    |  |
| 1.39 | 106.78 | 133.97 | 148.9 | 201.57 | 407.62 |  |
| 4.69 | 28.51  | 45.61  | 65.24 | 139.91 | 352.34 |  |

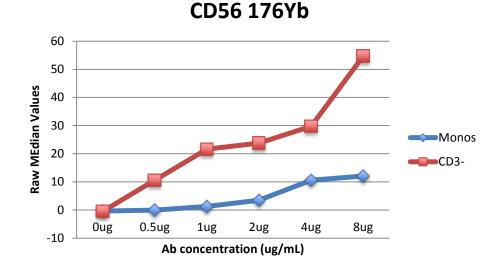
#### CD56 176Yb (Surface)

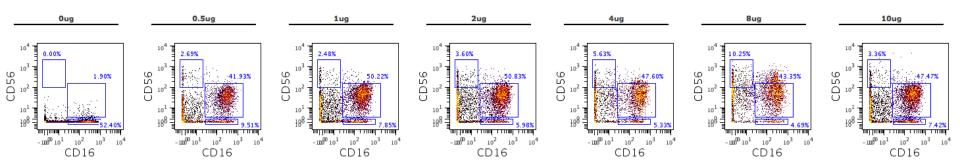
Clone: NCAM16.2 (BD) Conjugation: 2013-01-24

Titration: 2013-01-26

PBMCs – Live/frozen, thawed - rested 3h

Staining conc.: 1ug/mL





|     | Raw Median values |       |       |       |       |       |       |       |  |  |  |
|-----|-------------------|-------|-------|-------|-------|-------|-------|-------|--|--|--|
| 0   |                   | 8ug   | 4ug   | 2ug   | 1ug   | 0.5ug | 0ug   |       |  |  |  |
| . : | CD3-              | 54.71 | 29.75 | 23.81 | 21.65 | 10.58 | -0.47 | CD3-  |  |  |  |
| 4   | Monos             | 12.08 | 10.61 | 3.49  | 1.28  | -0.02 | -0.39 | Monos |  |  |  |

Day Madian Values

|       | 95 <sup>th</sup> percentile |        |        |       |        |        |  |  |  |  |  |
|-------|-----------------------------|--------|--------|-------|--------|--------|--|--|--|--|--|
|       | Oug 0.5ug 1ug 2ug 4ug       |        |        |       |        |        |  |  |  |  |  |
| CD3-  | 1.39                        | 106.78 | 133.97 | 148.9 | 201.57 | 407.62 |  |  |  |  |  |
| lonos | 4.69                        | 28.51  | 45.61  | 65.24 | 139.91 | 352.34 |  |  |  |  |  |